| 1 | The Relationship between External Environment and Physician' E-mail Communication: The |
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| 2 | Mediating Role of Health Information Technology (HIT) Availability |
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ABSTRACT

3 **Background**: Physician e-mail communication, with patients and other providers, is one of the 4 cornerstones of effective care coordination, but varies significantly across physicians. A 5 physician's external environment may contribute to such variations by enabling or constraining a 6 physician's ability to adopt innovations, such as health information technology (HIT) that can be 7 used to support e-mail communication. 8 **Purpose:** To examine whether the relationship external environment and physician' e-mail 9 communication with patients and other providers is mediated by practice's health information 10 technology (HIT) availability. 11 Methodology: The data were obtained from the Health Tracking Physician Survey (HTPS) 12 (2008) and the Area Resource File (2008). Cross-sectional multivariable subgroup path analysis 13 was used to investigate the mediating role of HIT availability across 2,850 U.S. physicians. 14 **Findings:** Solo physicians' perceptions about malpractice were associated with 0.97 lower odds 15 (p<0.05) of e-mail communication with patients and other providers, as compared to group and 16 hospital practices, even when mediated by HIT availability. Subgroup analyses indicated that 17 different types of practices are responsive to different dimensions of the external environment. 18 Specifically, solo practitioners were more responsive to the availability of resources in their 19 environment, with per capita income associated with lower likelihood of physician e-mail 20 communication (OR=0.99, p<0.01). In contrast, physicians working in the group practices were 21 more responsive to the complexity of their environment, with a physician's perception of 22 practicing in environments with higher malpractice risks associated with greater IT availability,

| 1 | which in turn was associated with a greater likelihood of communicating via e-mail with patients |
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| 2 | (OR; 1.02, p<0.05) and other physicians (OR; 1.03, p< 0.001). |
| 3 | Practical Applications: The association between physician' e-mail communication and external |
| 4 | environment is mediated by practice's health information technology (HIT) availability. Efforts |
| 5 | to improve physicians' e-mail communication and HIT adoption may need to reflect the varied |
| 6 | perceptions of different types of practices. |
| 7 | Keywords: physician' communication, health information technology, mediation analysis, |
| 8 | external environment |
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INTRODUCTION

4 Physician e-mail communication, with patients and other providers, is an important 5 component of effective care coordination (Mettner, 2009) as it is shown to improve patient and 6 physician outcomes (Forrest et al. 2000; Schoen et al. 2006). Approximately 20% of physicians 7 use e-mail to communicate with patients and about 65% with their peers (Menachemi, Prickett, 8 & Brooks, 2011; Houston, Sands, Nash, & Ford, 2003), but this practice varies greatly 9 throughout the country (O'Malley & Reschovsky, 2011; Pham, O'Malley, Bach, Saiontz-10 Martinez, & Schrag, 2009). According to resource-dependency theory, which highlights the 11 importance of availability of external resources, this variation may be partially attributed to 12 characteristics of a physician practices' external environment, such as practice location (Gupta, 13 O'Connor, & Quezada-Gomez, 2004) or socio-demographic characteristics of the surrounding 14 community (Rodriguez, von Glahn, Rogers, & Safran, 2009). 15 Policy makers have increasingly promoted the use of health information technology (HIT; e.g., the passage of Health Information Technology for Economic and Clinical Health Act 16 17 (HITECH)), in part to improve physician e-mail communication with patients and other 18 clinicians (Blumenthal, 2010). This interest has resulted in an unprecedented number of financial 19 resources being devoted to development of HIT availability in physician practices (Blumenthal, 20 2009). Importantly, however, these resources are not evenly distributed across markets (Center 21 for Medicaid and Medicare Services 2012; Rao et al. 2011), which may influence practice's HIT 22 availability and in turn, the amount of e-mail communication engaged in by these practices.

1 The purpose of this study was to examine the role of HIT availability as a potential 2 mediator of the relationship between the external environment and e-mail communication, 3 operationalized as the amount of time allocated on e-mail communication with other providers 4 and patients. Because different types of practices may have variable levels of interest and ability 5 to respond to changes in the external environment (Abdolrasulnia et al., 2008), the study will 6 also examine whether the mediational role of HIT availability between the external environment 7 and communication varies as a function of practice type (e.g., solo practitioners vs. group 8 practice).

9 The findings of the study may help policy makers and sponsors of HITs focus their 10 efforts to promote HITs in certain markets known to have low levels of HIT availability, which 11 in turn may support e-mail communication between patients and clinicians. Similarly, a better 12 understanding of whether HIT availability mediates the relationship between the external 13 environment and e-mail communication for different types of practices is important for 14 identifying opportunities and barriers to foster better communication in these settings.

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CONCEPTUAL FRAMEWORK

16 **Resource Dependence Theory**

It is our contention that physician practices adopt changes in their organizational structure (i.e., HIT capabilities) in response to constraints and opportunities available in their external resource environment, and that these changes have consequences for organizational processes (i.e., e-mail communication). Given the assumption of rational decision-making on the part of physician practices and the influence of the practice's technical environment (Meyer & Scott, 1983), resource dependence theory provides an appropriate theoretical lens for considering this relationship.

1 Resource dependence theory (RDT) is an open system theory that stipulates that an 2 organization's external environment provides resources needed to successfully engage in key 3 strategic and operational activities (Dess & Beard, 1984). However, because organizations 4 operate in different environments, they often adopt different structures and strategies to align 5 themselves with their external environment (Thompson, 1967; Venkatraman & Camillus, 1984). 6 Previous research has identified three primary dimensions of the external environment: 7 complexity, munificence, and dynamism (Dess & Beard, 1984; Zinn, Proenca, & Rosko, 1997). 8 Environmental complexity reflects the number of different actors/elements that need to be taken 9 into consideration when making strategic decisions. Environmental munificence reflects the 10 abundance of resources in the environment. Environmental dynamism reflects the rate of change 11 and thus uncertainty in the environment.

12 External Environment and Communication: The Mediating Role of HIT Availability

One means by which the external environment may influence physician e-mail communication is by promoting or hindering HIT availability. Research suggests that more complex and dynamic environments are associated with EMR adoption due to the uncertainty that these environments can create for organizations (e.g., unclear return on investment; Kazley & Ozcan, 2007). In contrast, more munificent environments help reduce a practice's dependence on other entities for resources (e.g., financial, technical, information) and can be used to facilitate electronic health record (EHR) adoption.

Other research has found that HIT availability is associated with improved
communication (Milne et al., 2014; Shachak, & Reis, 2009). For example, HIT availability is
associated with enhanced information exchange about active medications among providers and
facilitated discussion about pharmacy procedures between providers and the patients (Arar, Wen,

| 1 | McGrath, Steinbach & Pugh, 2005). Together, this research suggests that the relationship |
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| 2 | between the external environment and communication may be mediated by HIT availability. |
| 3 | Hypothesis 1: Physician practices in more munificent environments will be associated with |
| 4 | greater HIT availability, which in turn will be associated with more time allocated to e-mail |
| 5 | communication. |
| 6 | Hypothesis 2: Physician practices in more dynamic environments will be associated with lower |
| 7 | HIT availability, which in turn will be associated with less time allocated to e-mail |
| 8 | communication |
| 9 | Hypothesis 3: Physician practices in more complex environments will be associated with lower |
| 10 | HIT availability, which in turn will be associated with less time allocated to e-mail |
| 11 | communication. |
| 12 | Moderating Influence of Practice Type |
| 13 | In this study, we also consider the moderating role of practice type (solo practitioners, |

14 group practices, or hospital-based physicians). Different types of organizations often have 15 variable access to internal (e.g. managerial expertise and staff) and external (e.g., affiliation with 16 hospital) resources needed to manage the adoption process of new innovations such as HIT 17 (Castle 2001; Zinn, Proenca, & Rosko, 1998). We expect these differences to moderate the 18 influence of the external environment on HIT availability, and in turn, the amount of e-mail 19 communication engaged in by a physician practice.

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METHODS

The study uses a cross-sectional design to analyze the mediating role of HIT availability in the relationship between the external environment and physician e-mail communication. The data were obtained from the Health Tracking Physician Survey (HTPS) (2008) conducted by the

| 1 | Center for Studying Health System Change and the Area Resource File (2008) (Health Tracking |
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| 2 | Physician Survey Methodology Report, 2008). The HTPS consisted of nationally representative |
| 3 | sample of U.S. physicians. The response rate of among eligible participants was 61.9 %. |
| 4 | Observations with item specific missing values were discarded from the sample (N=1,870), |
| 5 | leaving a final analytic sample of 2,850 physicians. We compared individual level characteristics |
| 6 | (specialty, years in practice, gender) of those included in the analysis with those excluded using |
| 7 | chi-square and one-way analysis of variance tests and did not detect any statistically significant |
| 8 | differences between the groups. |
| 9 | Outcome Variable |
| 10 | Amount of e-mail communication with patients and other providers. E-mail |
| 11 | communication with patients and other providers was measured with 2 items that were modeled |
| 12 | individually in the analysis. The items were: 1) Amount of time allocated for e-mail |
| 13 | communications with patients and their families; 2) Amount of time allocated for e-mail |
| 14 | communication with physicians and other clinicians. The responses were provided on a 4-point |
| 15 | scale ranging from 0 (none) to 4 (more than 2 hours) plus the "not ascertained" category. "Not |
| 16 | ascertained" responses were coded as missing and excluded from final analysis. Our initial |
| 17 | attempts to model time allocated to email communication as an ordinal variable were |
| 18 | unsuccessful, however, with the Score test indicating that the variable did not meet the |
| 19 | proportional odds assumption. Therefore, the response categories were recoded into binary |
| 20 | variables, with none and less than a half hour categories coded as "0" and the remaining |
| 21 | categories coded as "1". |
| 22 | Explanatory Variables |

1 Environmental munificence was represented by community income level and 2 reimbursement. Community income level was operationalized as the average per capita income, 3 measured in \$1,000 units (income divided by population, multiplied by \$1,000). Reimbursement 4 was based on the physician's response to the following question: "Is your practice reimbursed by 5 any health insurance plans for these activities: 1. Email communications with family; 2. 6 Telephone communications with family; 3. Email communications with physicians and other 7 clinicians; and 4. Telephone communications with physicians and other clinicians."". The 8 response categories were: "Reimbursed", "Not Reimbursed", and "Unsure if reimbursed". 9 "Reimbursed" responses were coded as 1, "Not reimbursed" responses were coded as 0, and 10 "Unsure if reimbursed" responses were coded as missing and removed from further analysis. A 11 single reimbursement variable was then created by summing across the responses related to these 12 four activities (range 0 to 4). Environmental dynamism was measured as the change in the 13 unemployment and poverty rates from 2002 to 2007 (the five-year period preceding our study 14 data. Environmental complexity was measured as the degree of competition and the level of 15 malpractice concern perceived by physicians. Previous research indicates that medical practices 16 located in more complex environments, characterized by the presence of a malpractice crisis in 17 the state where the medical practice is located, were less likely to pursue a strategic initiative, 18 such as adoption of an electronic medical record (EMR) (Menachemi, Shin et al. 2011; 19 Menachemi, Mazurenko et al. 2012). The degree of competition was assessed with a single 20 question that asked respondents "Thinking about your practice specifically, how would you 21 describe the competitive situation your practice faces?" Responses options were "Not at all 22 competitive", "Somewhat competitive", and "Very competitive", which were subsequently 23 coded as 1, 2, and 3, respectively with higher values indicate perceptions of a more competitive

1 environment. Finally, the level of malpractice concern was constructed as the average across four 2 items that asked physicians to what degree they agreed with the following statements: 1. Will be 3 involved in a malpractice case sometime in the next 10 years; 2. Pressured in my day-to-day 4 practice by the threat of malpractice litigation; 3. Order tests or consultations simply to avoid the 5 appearance of malpractice; and 4. Ask for consultant opinions primarily to reduce my risk of 6 being sued. Responses to all four items were recorded on five point scales ranging from 7 "Strongly Disagree" (1) to "Not Sure" (3) to "Agree Strongly (5); thus, higher scores indicated 8 greater concerns about malpractice.

9 Mediating Variable

HIT availability. The HTPS included seventeen questions about the availability of
electronic health records (EHR) and various HIT applications, such as ordering laboratory tests,
exchanging clinical data with other physicians, hospitals or laboratories, and electronically
transmitting prescriptions to pharmacies (See Appendix 1 for the list of HIT applications). The
response categories were: "yes, application is available", or "no, application is not available". A
summated scale was developed from these 17 questions to obtain a single variable (range 0 to
17) reflecting the health information technology (HIT) availability in a physician's practice.

17 Moderating Variable

Practice type. Practice type was included as a moderating variable and was measured
 through a series of dummy variables: solo/2physicians ; group with 3 physicians or more; and
 hospital-based practices.

21 Control Variables

We also included the following control variables: physician demographic characteristics
(gender, race), professional characteristics (specialty, years in practice) and practice

characteristics (practice type). Gender was operationalized as a binary variable, where male was
 coded as one and female coded as zero. Race was specified as a binary variable representing
 non-Hispanic white coded as one and others coded as zero. Specialty was coded as a binary
 variable, where primary care provider (PCP) is coded as one and the rest are coded as zero.

5 Analytic Strategy

6 The unit of analysis was the physician practice. This was driven by the fact that HTPS 7 survey asks respondents both physician level (e.g. specialty, years in practice) and practice level 8 attributes (e.g. HIT availability) and the primary items of interest for this paper were practice 9 level attributes. A multivariable subgroup path analysis was used to analyze the mediating role of 10 HIT availability in the relationship between the external environment and amount of e-mail 11 communication. A multivariable path analysis is an extension of multiple regression that enables 12 researchers to test a theory of causal ordering among a set of variables (e.g., X causes Y and Y 13 causes Z) by treating these relationships as a system of regression models whose parameters and 14 standard errors are estimated simultaneously (MacKinnon, 2008). A multivariable path analysis 15 has several advantages over the causal steps approach (e.g. Baron & Kenny, 1986). First, 16 simulation studies have shown that the causal steps approach has low power relative to other 17 methods for testing indirect effects (Fritz & MacKinnon, 2008). Second, studies have shown that 18 it is possible to detect significant indirect effects in the absence of direct effects between the 19 constituent paths, a precondition in the causal steps approach (Hayes, 2009; Zhao, Lynch, & 20 Chen, 2010). Finally, the causal steps approach typically entails using the Sobel test to make 21 inferences about the statistical significance of indirect effects, which requires an assumption that 22 the sampling distribution of the indirect effect is normal but is often not the case (Bollen & Stine, 23 1992). Newer methods such as bootstrapping provide tests that do not require such assumptions.

| 1 | Thus, multivariable path analysis provides a more parsimonious yet comprehensive approach to |
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| 2 | analyzing both direct and indirect effects of exogenous variables. Results are presented as |
| 3 | standardized regression coefficients and odds ratios to facilitate comparisons across variables. |
| 4 | FINDINGS |
| 5 | Physician, practice and environmental characteristics are presented in Table 1. |
| 6 | Respondents were predominately male (71.9%), White (74.7%), and board certified in their |
| 7 | practice specialty (91%). More than half of the responding physicians were working in a practice |
| 8 | with more than three physicians (55.8%) and nearly half (47.3%) were primary care physicians |
| 9 | (PCPs). The mean community income across markets was \$41,129. |
| 10 | INSERT TABLE 1 ABOUT HERE |
| 11 | Less than 5% of physician respondents reported spending more than 30 minutes e- |
| 12 | mailing patients. In comparison, 21.2% of all physician respondents reported spending more than |
| 13 | 30 minutes e-mailing other providers. Solo/2-person practices were more likely to report no e- |
| 14 | mail communication with patients (79.1%) compared to group practices (73.6%) and hospital- |
| 15 | based practices (71.2%; χ^2 =23.5, p<0.01; Table 2). Similarly, solo/2-person practices were more |
| 16 | likely to report no e-mail communication with other providers (67.8%) compared to group |
| 17 | practices (39.6%) and hospital-based physicians (21.0%; χ^2 =381.5, p<0.001). On average, |
| 18 | physician practices reported 7.1 HIT capabilities available (SD=4.0, range=0-14). A one-way |
| 19 | analysis of variance (ANOVA) indicates that solo/2-person practices had significantly fewer IT |
| 20 | capabilities available (M=5.8, SD=4.0) compared to group (M=7.71, SD=3.9) and hospital-based |
| 21 | (M=7.9, SD=3.7) practices (F=77.6, p<0.001). |
| 22 | INSERT TABLE 2 ABOUT HERE |

| 1 | Overall, the analysis suggests that environmental characteristics are indirectly associated |
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| 2 | with e-mail communication via HIT availability, although the indirect relationships are more |
| 3 | pronounced for certain environmental dimensions and practice types. Detailed results for each |
| 4 | dimension and practice type are presented below. |
| 5 | Munificence. Hypothesis 1 was not supported by our analysis. Higher levels of |
| 6 | community income were negatively associated email communication with patients (OR= 0.99, |
| 7 | p<0.001) and providers (OR= 0.99, p<0.001) when mediated by HIT availability of the practice. |
| 8 | This was because higher levels of community income were associated with lower HIT |
| 9 | availability (OR=0.95, p<0.001). Similarly, solo physicians practicing in more munificent |
| 10 | environments, when measured as receiving financial incentives for engaging in communication |
| 11 | activities, were more likely to report e-mail with other physicians (OR= 1.14, p<0.005), but the |
| 12 | indirect relationships between reimbursement and e-mail communication were not statistically |
| 13 | significant. |
| 14 | Dynamism. Hypothesis 2 was partially supported by our analysis. Specifically, an |
| 15 | increase in the unemployment rates decreased e-mail communication with patients (OR=0.98, |
| 16 | p<0.5) and other providers (OR=0.99, p<0.5), when mediated by HIT availability, but only for |
| 17 | group practice physicians. Contrary to our prediction, an increase in the poverty rates increased |
| 18 | e-mail communication with patients (OR=1.20, p<0.05) and other providers (OR=1.01, p<0.05), |
| 19 | when mediated by HIT availability, but again only for group practice physicians. |
| 20 | Complexity. Our analysis found the strongest support for Hypothesis 3. Solo and hospital- |

based physicians who expressed greater concerns about the malpractice environment reported
 lower HIT availability, which in turn, was associated with lower likelihood of e-mail
 communication with patients (solo: OR=0.97, p<0.05) and other providers (solo: OR=0.97,

| 1 | p<0.05; hospital-based: OR=0.75, p<0.001). Contrary to our predictions, group-based physicians |
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| 2 | who expressed greater concerns about the malpractice environment reported more robust HIT |
| 3 | availability, which was associated with a greater likelihood of e-mail communication with |
| 4 | patients (OR=1.03, p<0.05) and other providers (OR=1.02, p<0.01). |
| 5 | INSERT TABLE 3 ABOUT HERE |
| 6 | DISCUSSION |
| 7 | One important finding of our study was that measures of environmental complexity were |
| 8 | most consistently associated with physician e-mail communication, even when mediated by HIT |
| 9 | availability. We found that solo and hospital-based physicians who expressed greater concerns |
| 10 | about the malpractice environment reported lower HIT availability, which in turn, was associated |
| 11 | with lower likelihood of e-mail communication with patients and other providers. This finding is |
| 12 | congruent with previous research (Bertram, Hershey, Opila, & Quirin, 1990; Menachemi et al., |
| 13 | 2012) that suggests more complex environments can create "distractions", such as fear of |
| 14 | potential lawsuits, and adversely impact decision-making processes and daily activities. |
| 15 | Although HIT, and electronic health records (EHR) in particular, can facilitate legal and |
| 16 | regulatory compliance (Agrawal, 2002) by confidentially storing patient records, our results |
| 17 | indicate that solo and hospital-based physicians practicing in more complex markets either are |
| 18 | not be aware of these benefits or have yet to take advantage of them. |
| 19 | Our findings with respect to other environmental dimensions were more mixed. |
| 20 | Specifically, measures of environmental munificence exhibited significant indirect relationships |
| 21 | with e-mail communication, but in the opposite direction of what was predicted. One potential |
| 22 | explanation for this finding is that physicians who are located in higher income communities |
| 23 | may care for healthier patients with lower demands to for engaging in extensive communication |
| | |

and care coordination. Consequently, these practices may invest fewer resources into building
 robust HIT systems used for e-mail communication with patients and other providers.

3 Finally, our findings suggest that certain practice types are more sensitive to their 4 external environment than others. Specifically, solo practices appeared to be the most responsive 5 to changes in their environment in ways that affected their e-mail communication with patients 6 and other providers, even when mediated by HIT availability. This could be due to fewer 7 resources available to this practice type. Although the HITECH Act is intended to address certain 8 financial barriers to HIT adoption, the impact of this legislation may be attenuated because of 9 certain market factors that play a particularly important role for practices with fewer resources. 10 Several limitations should be considered when interpreting our findings. First, although

11 resource-dependency theory is widely used in the strategic management literature, it may not be 12 exhaustive in capturing a physician practice's environment (Yeager et al., 2014). Second, the 13 data presented are cross-sectional, thus we are not able to comment on the causality of the 14 relationships. Third, our study used "self-reported" measures of communication, which have 15 notable limitations such as desirability bias. Future studies should consider using more objective 16 measures of communication. Likewise, our measure of HIT availability was based on a sum of 17 dichotomous items indicating the presence or absence of HIT capabilities and does not reflect the 18 level of use or how long these capabilities have been used by a practice. Finally, we were not 19 able to control for the patient population served by a given physician practice (e.g. demographic 20 characteristics).

21

PRACTICE IMPLICATIONS

Our study revealed generally low levels of e-mail communication among physicians, with
 both patients and other physicians. Although more recent research is needed to assess whether

1 this is still the case, it seems plausible that circumstances have not changed so dramatically that 2 electronic communication is commonly occurring among physicians. Such low levels suggest 3 that, despite developments in HIT and increased policy attention toward promoting the use of 4 HIT, more efforts, including non-technological ones, may be needed to promote e-mail 5 communication by physicians. For example, renewed interest in new models of care such as the 6 PCMH that emphasize care coordination and shared decision making with patients may remedy 7 this problem. Likewise, reimbursement models that compensate physicians for e-mail 8 consultations may also encourage greater use of electronic communication. 9 Regardless of the specific effort, our findings also indicate that "one size fits all" 10 approaches to foster communication may not be as effective as desired. More specifically, our 11 findings indicate that the mediational role of HIT availability varies by environmental 12 dimension, with physicians who practice in more complex environments associated with less 13 robust HIT availability, which, in turn, was associated with lower likelihood of e-mail 14 communication. Such findings suggest that resource availability may not be the sole or even 15 primary driver of HIT adoption and use and subsequent use of this technology to engage in 16 electronic communication. Thus, policy makers and other sponsors and advocates of HIT may 17 want to consider how the allocation of existing resources may influence decisions regarding HIT 18 adoption and use. In particular, our analysis suggests that the malpractice environment may play 19 a significant role in such decisions. Similarly, we found that solo practitioners' e-mail 20 communication patterns are most responsive to their external environment, even after the 21 mediational role of HIT availability is taken into consideration. Thus, despite the efforts of the 22 HITECH Act, payers and policy makers may want to reconsider how resources are allocated to 23 this group of practitioners. Given the well-known barriers to HIT adoption, including high up-

| 1 | front investment, | payers and p | policy makers | may want to consider | more targeted, | group specific |
|---|-------------------|--------------|---------------|----------------------|----------------|----------------|
| | | | | | | |

- 2 policies that could influence providers' behaviors and communication patterns. This could
- 3 include, but is not limited to, education and on-going support for HIT adoption and
- 4 implementation or potential partnership with larger groups that are more successful in this realm.

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| | | All practices | |
|---------------------|--|-----------------|--|
| Amount of commun | nication with patients and other providers | | |
| E-mail communica | ations with patients | Frequency (%) | |
| | < 30 minutes | 2,722 (95.5%) | |
| | > 30 minutes | 128 (4.5%) | |
| E-mail communica | ation with physicians | | |
| | < 30 minutes | 2,246 (78.8%) | |
| | > 30 minutes | 604 (21.2%) | |
| | | Mean (S.D.) | |
| IT availability | | 7.2 (4.0) | |
| Environmental Cha | aracteristics | Mean (S.D.) | |
| Per Capita Income | in 2006 | 41,129 (11,853) | |
| Number of activitie | es reimbursed | 1.12 (0.63) | |
| Perceived competi | tion | 2.10 (0.73) | |
| Perceived malprac | 3.67 (1.00) | | |
| Change in % of pe | -0.77 (1.89) | | |
| Change in unemple | 1.12 (1.30) | | |
| Physician Charact | Frequency (%) | | |
| Gender | Male | 2,048 (71.9%) | |
| | Female | 802 (28.1%) | |
| Mean years in prac | ctice (SD) | 16.5 (9.6) | |
| Specialty | Primary Care Provider | 1,348 (47.3%) | |
| | Other | 1,502 (52.7%) | |
| Board Certified | | 2,593 (91.0%) | |
| Practice Type | Solo/2 physicians | 887 (31.1%) | |
| | Group>=3 physicians | 1,591 (55.8%) | |
| | Hospital-owned | 372 (13.1%) | |
| Race | White | 2,128 (74.7%) | |
| | Other | 722 (25.3%) | |
| | | | |
| | | | |
| | | | |

Table 1. Physician and environmental characteristics of the sample (N=2,850)

| | Solo/2 person practices | Group practices | Hospital-based practices | Test statistic |
|--------------------------------|-------------------------|-----------------|--------------------------|------------------------------|
| IT availability (M / SD) | $5.8 (4.0)^{2,3}$ | $7.7 (3.9)^1$ | $7.9(3.7)^1$ | F=77.6, p<0.001 |
| E-mail with patients (N / %) | | | | |
| 0 (none) | 702 (79.1%) | 1,171 (73.6%) | 265 (71.2%) | $\chi^2 = 23.5, p < 0.01$ |
| 1 (<30 minutes) | 138 (15.6%) | 358 (22.5%) | 88 (23.7%) | |
| 2 (30-60 minutes) | 35 (4.0%) | 51 (3.2%) | 14 (3.8%) | |
| 3 (1-2 hours) | 8 (0.9%) | 7 (0.4%) | 4 (1.1%) | |
| 4 (> 2 hours) | 4 (0.5%) | 4 (0.3%) | 1 (0.3%) | |
| E-mail with physicians (N / %) | | | | |
| 0 (none) | 601 (67.8%) | 630 (39.6%) | 78 (21.0%) | $\chi^2 = 381.5, p < 0.001)$ |
| 1 (<30 minutes) | 199 (22.4%) | 612 (38.5%) | 126 (33.9%) | |
| 2 (30-60 minutes) | 56 (6.3%) | 229 (14.4%) | 87 (23.4%) | |
| 3 (1-2 hours) | 30 (3.4%) | 77 (4.8%) | 52 (14.0%) | |
| 4 (> 2 hours) | 1 (0.1%) | 43 (2.7%) | 29 (7.8%) | |

Table 2. Comparison of communication and IT availabilityby practice type (N=2,850)

¹ Significantly different than solo/2-person practices at p<0.05.
 ² Significantly different than group practices at p<0.05.
 ³ Significantly different than hospital-based practices at p<0.05.

| | Solo Practitioner B (OR) | Group Practice B (OR) | Hospital-based B (OR) |
|--|---------------------------------|-------------------------------|-----------------------------|
| Environmental Munificence | | | |
| Per capita income \rightarrow Time emailing patient | 0.028*** (1.03) | 0.007 (1.01) | 0.021 (1.02) |
| Per capita income \rightarrow IT Cap \rightarrow Time emailing patient | $-0.005^{**}(0.99)^{2,3}$ | $0.001 (1.00)^1$ | $0.001 (1.00)^1$ |
| Total effect of per capita income on time emailing patient | 0.023 (1.02) | 0.009 (1.01) | 0.022 (1.02) |
| Per capita income \rightarrow Time emailing other physicians | $0.019^{**}(1.02)^2$ | $-0.001 (0.99)^1$ | 0.005 (1.01) |
| Per capita income \rightarrow IT Cap \rightarrow Time emailing other physicians | -0.005*** (0.99) ^{2,3} | $0.001 (1.00)^1$ | $-0.001 (0.99)^1$ |
| Total effect of per capita income on time emailing other physicians | 0.014 (1.01) | -0.001 (0.99) | 0.004 (1.01) |
| Reimbursement \rightarrow Time emailing patient | -0.177 (0.84) | 0.310 (1.36) | -0.135 (0.87) |
| Reimbursement \rightarrow IT Cap \rightarrow Time emailing patient | 0.043 (1.04) | -0.014 (0.99) | 0.001 (1.00) |
| Total effect of per capita income on time emailing patient | -0.134 (0.87) | 0.297 (1.35) | -0.134 (0.87) |
| Reimbursement \rightarrow Time emailing other physicians | 0.132** (1.14) | 0.186 (1.20) | 0.063 (1.07) |
| Reimbursement \rightarrow IT Cap \rightarrow Time emailing other physicians | 0.044 (1.04) | -0.011 (0.99) | 0.008 (1.01) |
| Total effect of per capita income on time emailing other physicians | 0.176 (1.19) | 0.175 (1.19) | 0.071 (1.07) |
| Environmental Dynamism | | | |
| Change in unemployment \rightarrow Time emailing patient | 0.124 (1.13) ^{2,3} | 0.115 (1.12) ^{1,} | 0.129 (1.14) ^{1,} |
| Change in unemployment \rightarrow IT Cap \rightarrow Time emailing patient | -0.014 (0.99) | -0.017* (0.98) | 0.003 (1.00) |
| Total effect of change in unemployment on time emailing patient | 0.111 (1.12) | 0.097 (1.10) | 0.132 (1.14) |
| Change in unemployment \rightarrow Time emailing other physicians | 0.047 (1.05) | $-0.036 (0.96)^3$ | $0.138^* (1.15)^2$ |
| Change in unemployment \rightarrow IT Cap \rightarrow Time emailing other physicians | $-0.014 (0.99)^3$ | $-0.013^{*}(0.99)^{3}$ | 0.020 (1.02) ^{1,2} |
| Total effect of change in unemployment on time emailing other physicians | 0.033 (1.03) | -0.049 (0.95) | 0.158** (1.17) |
| Change in poverty \rightarrow Time emailing patient | -0.029 (0.97) | -0.078 (0.92) | 0.003 (1.00) |
| Change in poverty \rightarrow IT Cap \rightarrow Time emailing patient | $-0.006 (0.99)^2$ | 0.018** (1.20) ^{1,3} | $-0.002 (0.99)^2$ |

Table 3. Multivariable subgroup path analysis: mediating role of HIT availability (N=2,850)

| -0.035 (0.97) | -0.060 (0.94) | 0.001 (1.00) |
|---------------------------------|--|--|
| | -0.181*** (0.83) ^{1,3} | $-0.049 (0.95)^2$ |
| × , | $0.014^{**}(1.01)^{1.3}$ | $-0.014 (0.99)^2$ |
| × , | -0.167*** (0.85) | -0.063 (0.94) |
| 0.010 (0.90) | | |
| 0.011 (1.01) | $-0.165^{**}(0.85)^3$ | $0.094 (1.10)^2$ |
| | | $0.001 (1.00)^{1,2}$ |
| $-0.026^{*}(0.97)^{2,3}$ | | · · · · · |
| -0.015 (0.99) | -0.134* (0.87) | 0.095 (1.10) |
| -0.018 (0.98) | $-0.134^{***}(0.87)^3$ | $-0.296^{***}(0.74)^2$ |
| $-0.027*(0.97)^2$ | $0.024^{***} (1.02)^1$ | 0.007 (1.01) |
| 0.045 (1.05) | -0.110** (0.90) | -0.290*** (0.75) |
| 0.036 (1.04) | -0.005 (0.99) | 0.206 (1.23) |
| -0.013 (0.99) | -0.003 (0.99) | 0.005 (1.01) |
| 0.414 (1.51) | -0.008 (0.99) | 0.211 (1.23) |
| 0.144 (1.15) | 0.124* (1.13) | 0.053 (1.05) |
| -0.013 (0.99) | -0.002 (0.99) | 0.029 (1.03) |
| 0.131 (1.14) | 0.122 (1.13) | 0.082 (1.09) |
| -0.992*** (0.37) ^{2,3} | $0.047 (1.05)^1$ | $-0.251 (0.78)^1$ |
| 0.032 (1.03) | -0.021 (0.98) | 0.003 (1.00) |
| -0.960*** (0.38) | 0.025 (1.03) | -0.248 (0.78) |
| -0.121 (0.89) | $-0.193^{*}(0.82)^{3}$ | $0.121 (1.13)^2$ |
| 0.034 (1.03) | -0.017 (0.98) | 0.019 (1.02) |
| -0.088 (0.92) | -0.210* (0.81) | 0.140* (1.15) |
| | | |
| | | |
| | $\begin{array}{c} -0.018 \ (0.98) \\ -0.027^* \ (0.97)^2 \\ 0.045 \ (1.05) \\ 0.036 \ (1.04) \\ -0.013 \ (0.99) \\ 0.414 \ (1.51) \\ 0.144 \ (1.51) \\ 0.144 \ (1.15) \\ -0.013 \ (0.99) \\ 0.131 \ (1.14) \\ -0.992^{***} \ (0.37)^{2.3} \\ 0.032 \ (1.03) \\ -0.960^{***} \ (0.38) \\ -0.121 \ (0.89) \\ 0.034 \ (1.03) \end{array}$ | $\begin{array}{ccccccc} -0.035(0.97) & -0.181^{***}(0.83)^{1.3} \\ -0.040(0.96)^2 & 0.014^{**}(1.01)^{1.3} \\ -0.006(0.99)^2 & 0.014^{**}(0.85) \\ \hline & 0.011(1.01) & -0.165^{**}(0.85)^3 \\ -0.046(0.96) & -0.167^{***}(0.85)^3 \\ -0.026^{*}(0.97)^{2.3} & 0.031^{**}(1.03)^{1.3} \\ -0.015(0.99) & -0.134^{*}(0.87)^3 \\ -0.018(0.98) & -0.134^{***}(0.87)^3 \\ -0.027^{*}(0.97)^2 & 0.024^{***}(1.02)^1 \\ 0.045(1.05) & -0.110^{**}(0.90) \\ 0.036(1.04) & -0.005(0.99) \\ -0.013(0.99) & -0.003(0.99) \\ 0.144(1.51) & 0.102(0.99) \\ 0.144(1.51) & 0.124^{*}(1.13) \\ -0.092(0.99) & -0.002(0.99) \\ 0.131(1.14) & 0.122(1.13) \\ -0.992^{***}(0.37)^{2.3} & 0.047(1.05)^1 \\ 0.032(1.03) & -0.021(0.98) \\ -0.960^{***}(0.38) & 0.025(1.03) \\ -0.121(0.89) & -0.193^{*}(0.82)^{3} \\ 0.034(1.03) & -0.017(0.98) \\ \end{array}$ |

Figure 1. Relationship between external environment, HIT availability and communication:

