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Information and Policy Innovation in U.S. States

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Scott J. LaCombe¹^(b), Caroline Tolbert²^(b), and Karen Mossberger³

Abstract

Information is a critically important, yet hard to measure, component on policy innovation across state governments. Widespread use of broadband has made it easier for governments to observe other actors, increasing the amount of policy information, while also diversifying the sources of information available to policymakers. This should translate into making governments more innovative over time and quicker to adapt to challenges. At the same time, the Internet may disrupt previous existing flows of information by decreasing the importance of geographic proximity and creating more nationalized or global information networks. We argue that the growth of broadband has made states more innovative over time, while also reducing the reliance on neighboring state adoptions for policy solutions as the information environment becomes both richer and more nationalized. We estimate a pooled event history analysis on hundreds of policies comparing the treatment period (2000–2016) with a control condition (last two decades of the 20th century) and find that states with higher broadband subscriptions are more innovative overall and less reliant on geographic contiguity for policy solutions. The growth of information flows due to digital communications has led to states becoming more innovative while also operating in a more nationalized network.

Keywords

diffusion, broadband, information, public policy

How has the growth of broadband access and digital information affected the diffusion of public policies across the U.S. states over time? Over the past two decades, broadband, or high-speed Internet, has fundamentally transformed how information is consumed and spreads. The changes are comparable with the invention of the printing press, telegram, and telephone (Chadwick 2017; Shirky 2008; Silver 2015). Each of these new technologies transformed society and structurally altered how information flows. Former Organisation for Economic Co-operation and Development (OECD) chief economist Ignazio Visco has argued that because of broadband

The dramatic fall in communication costs [. . .] and the technological breakthroughs behind it, have led to a diffusion of ideas, technological know-how and a general spread of information at a pace that is quite unprecedented in the history of humankind. (Clark and Thompson 2012)

This study examines how variation in household broadband subscription rates has influenced the spread of policy adoptions across U.S. states. Information plays a central role in the diffusion of policy solutions, and states with higher rates of broadband subscriptions operate in a more information-rich, nationalized environment. Measuring broadband subscriptions, or the percent of the population with high-speed Internet access, provides an indicator of how widespread and inclusive information networks are within states, potentially enriching the flows of information. Despite the critical significance of the Internet for information and communication, the role of broadband access and use has not previously been considered in a systematic way to explain the diffusion of policies across the states.

Some diffusion scholars have documented that states have become more innovative over time (Boehmke and Skinner 2012), with others offering digital information and communication technologies as an explanation for this trend because they increase the speed at which

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Scott J. LaCombe, Department of Government and Department of Statistical and Data Sciences, Smith College, 201 Wright Hall, Northampton, MA 01060, USA. Email: lacombe129@gmail.com information travels (Boushey 2010, 23). We argue that the growth of broadband access and use may help explain differences in state innovation as well as other changes such as the decline in the importance of geography in the spread of new policy ideas. The Internet may not only increase the speed at which ideas circulate but also change the flow of information by creating more nationalized information environments.

To our knowledge, this study is the first to examine the influence of broadband connectivity in state-to-state policy diffusion. We model thousands of adoptions of state policies over the past four decades through a pooled event history analysis (PEHA; Kreitzer and Boehmke 2016) using the State Policy Innovation and Diffusion (SPID) database (Boehmke et al. 2020). The results suggest digital information access is associated with significantly higher rates of policy innovation. These results hold in an instrumental variable analysis that strips out factors that may predict both innovation and broadband.

We also find that widespread Internet use has significantly reduced the influence of geographic proximity on policy adoption. While geographic contiguity, or neighboring states, still positively predicts state policy adoption, high rates of broadband use reduce its importance. Taken together, our findings suggest that broadband connectivity has created a more information-rich, nationalized environment where policies spread more quickly and are less dependent on geography to spread.

Growing Innovation and Nationalization of the Diffusion Network

Political scientists have long studied what causes some policies to diffuse widely and others to not, with a focus on the comparative advantage of studying the fifty U.S. states (Gray 1973; Walker 1969). F. S. Berry and Berry's (1990) introduction of event history analysis (EHA) opened a new wave of interest in policy diffusion as scholars could use internal (i.e., legislative professionalism, population, state ideology) and external (i.e., neighboring state adoptions, latent diffusion ties) characteristics of states to model policy diffusion across geography. This methodological change led to a large growth in single policy studies that provided important insights to the predictors of policy diffusion (Boushey 2010; Grossback, Nicholson-Crotty, and Peterson 2004).

Recently, there has been a shift toward studies that take a large-*N* approach to measuring policy diffusion, often using dozens or hundreds of policies to systematically identify spatial patterns of policy diffusion (Boehmke et al. 2020; Boehmke and Skinner 2012; Boushey 2010; Bricker and LaCombe 2020; Karch et al. 2016; Mallinson 2021). This trend has enabled researchers to identify consistent and more generalizable diffusion patterns across multiple policy areas. The SPID dataset (Boehmke et al. 2020) is the most comprehensive to date, with data on thousands of policies across all topic areas, ranging from gun control measures, to abortion restrictions, to regulatory policies from the Uniform Law Commission.

Despite the variety in methodological and theoretical approaches to understanding how policies spread, a central component is typically the role of information exchanges in policy diffusion (Boushey 2010; Nicholson-Crotty and Carley 2018), although this is typically not measured directly but rather through the ways that information flows, be it due to geographic proximity, a contagion effect, or latent diffusion ties. Whether competing, learning, or imitating (Shipan and Volden 2008), states use information about what other states are doing when they innovate, or adopt new policies.¹ Information plays a vital role in the spread of ideas and states' ability to find policy prescriptions for emerging problems (Hale 2011). Information is not just constrained to adopting policies with successful outcomes such as higher economic growth or increased approval from voters. For example, previous adopters send information to other states about the ideological location of a policy (Grossback, Nicholson-Crotty, and Peterson 2004) so lawmakers can quickly learn if a new policy is politically viable (Butler et al. 2017).

We focus on two recent dynamics that have been observed by those who study state policy diffusion.² First, states have become more innovative over time (Boehmke et al. 2020; Boehmke and Skinner 2012). Whether using Walker's (1969) original innovativeness score or the more recent "rate score" (Boehmke and Skinner 2012), states have experienced a rapid growth in innovativeness beginning in the 1990s. The cause of recent spikes in the number of policy adoptions is less clear. We argue that broadband has contributed to this dynamic by increasing the availability of information to policymakers to learn about policies adopted across states and local communities.

Second, scholars have found that states are more likely to adopt policies when neighboring states have already done so (W. D. Berry and Baybeck 2005; Gray 1973; Walker 1969). Geographic proximity means states can easily observe what policies neighboring states are adopting, and citizens near state borders are likely exposed to neighboring state policy changes (Pacheco 2012). Walker (1969) argued that contiguity played an important role in diffusion because it facilitates information flows for elites to learn about new ideas and receive other relevant cues about whether they should adopt a policy. Geographic proximity suggests that the cost of getting information about neighboring state policies is lower than learning about state policies hundreds or thousands of miles away.

Digital Information Access and State Information Networks

Digital information now drives participation in politics, jobs and commercial activity (DiMaggio and Bonikowski 2008), economic growth, and societal change, yet Internet access (both at the micro and macro level) is unequal (Mossberger, Tolbert, and Franko 2012; Mossberger, Tolbert, and Stansbury 2003; Norris 2001; Schlozman, Verba, and Brady 2010; Tomer, Kneebone, and Shivaram 2017). This is patterned by race, ethnicity, education, income, and age, and unevenly distributed across communities and states (Mossberger, Tolbert, and LaCombe 2021). There is considerable variation in broadband subscription rates across states. In 2014, for example, there was a 23 percent gap between the state with the highest (New Hampshire at 86%) and lowest (Mississippi 63%) household broadband subscription rate. From 2005 to 2009, when broadband subscriptions were rapidly increasing across the county, this gap between the most and least connected states grew to as large as 35 percent. On average, states in the South tend to have the lowest subscription rates, while those in the North East and West Coast have the highest. How might we expect this to affect information networks within states and across state lines? Why is it that broadband subscriptions in the population (not just in the halls of the state capitol) might change how policies diffuse?

Broadband affects what policy scholars have called the public, systemic, or government agenda (Cobb and Elder [1972] 1983; Kingdon 1995) through the availability of information and opportunities to communicate ideas and preferences with other citizens and/or policymakers such as legislators or administrators. Such public agendas have traditionally been measured by issue attention in the media (Baumgartner and Jones 1993; Downs 1972; Jones and Baumgartner 2005; Kingdon 1995; Zahariadis 2016). While local television and newspaper coverage highlight local candidates and issues (Prior 2006; Stromberg and Snyder 2008), digital media has shifted information flows to national sources that cover the entire country rather than focus on local topics (Hindman 2008; Lelkes, Sood, and Iyengar 2015).

Broadband and digital media have changed the information environment in other ways as well, diversifying sources beyond traditional media and incorporating new forms of civic engagement (Feezell 2018). Broadband provides new platforms such as social media for public discussion and displays of public opinion that policymakers can view (Gainous and Wagner 2013), and that are in turn often amplified by the traditional press in a hybrid media environment (Chadwick 2017). In this environment, more issues may have a chance to emerge on the public agenda and possibly legislative agendas. The costs of media diversification and fragmentation has been debated (Sunstein 2007), but one impact may be the introduction of more ideas and issues in the public sphere, and more nationalized public agenda.

Ideas considered by policymakers may come from a variety of sources—from interest groups, media, think tanks, professional networks, and informal contacts with other states (Balla 2001; Boushey 2010; Garrett and Jansa 2015; Kingdon 1995; Mossberger 2000). High-speed Internet has meant that over time, state policymakers can easily access a variety of sources and ideas, such as looking up model legislation from the National Conference of State Legislatures (NCSL) or advocacy groups (see West 2004 on e-government). More policy alternatives can be accessed more quickly, with more detailed information than in the past.

A significant body of research finds a positive effect of contiguity on policy adoption (W. D. Berry and Baybeck 2005; Walker 1969; see Gilardi 2016, and Maggetti and Gilardi 2016 for detailed overviews of how geographic proximity has been used in diffusion research). In the most comprehensive meta-analysis review to date of diffusion studies, Mallinson (2020) finds that neighbors/ geographic contiguity remains one of the most common covariates in models of state policy diffusion (73% of the 507 studies analyzed), along with measures of slack resources, ideology, and legislative professionalism. Mallinson notes this is one of the few variables in his literature review that has a consistently positive effect on policy innovation across hundreds of publications, albeit with heterogeneous effects depending on the issue area. His final conclusion is that "there is evidence of general effects across the existing studies for the positive effects of neighbor adoptions . . ." (Mallinson 2020, 26). Geographic continuity is thus a primary explanation for why states adopt new policies.

Today there is an ongoing discussion in the literature on both re-evaluating the role of traditional diffusion predictors and explaining the variation in their effects over time. While Mooney (2001) argues that the field has not sufficiently tested the implicit theoretical underpinnings of geographic proximity driving learning, others have countered that it may only apply to certain policies or may mask other underlying processes. For example, there should be heterogeneity in contiguity's effect on policy diffusion because government leaders may learn that a policy causes harm (however defined) so neighboring states should be less likely to adopt a failed policy (Dolowitz and Marsh 1996). Mooney (2001) also posits that in more nationalized information environments, shared state borders should play a smaller role.

Scholars have increasingly identified alternative pathways for state policies to diffuse. Desmarais Harden, and Boehmke (2015), for example, leveraged over time policy adoptions across hundreds of policy areas and thousands of unique state policy adoptions to identify "latent diffusion ties," or pathways new policies persistently take; in so doing, the research identifies a state policy network with some states as sources for future policy adoptions. Other scholars have leveraged unique public opinion data over time to identify which states are perceived as similar to each other; the result shows that citizen perceptions play a much stronger role than geographic proximity in state policy diffusion over time (Bricker and LaCombe 2020).

Mallinson (2021) found that geographic contiguity's influence has waned in the last few decades. Boushey (2010, 60–61) suggests that changes in information and communication technologies may have sped up these diffusion processes, but he does not directly test this. While we cannot directly test the processes by which broadband increases the flow of policy ideas, prior research identifies many ways technology increases the volume, speed, and reach of information. Over time, with advances in digital technologies and applications, we expect that this may expand state information networks for both the public and government officials.

Research Hypotheses: Digital Information and State Policy Adoptions

Rising from less than 5 percent of the population with a home broadband connection in 2000 to 85 percent in 2018 (combining wired or satellite home broadband 65 percent and cell phone only 20 percent, American Community Survey 2020), the past two decades have seen a dramatic transformation of digital information access.³ The growth of broadband connectivity has been primarily due to private investment and infrastructure, not federal or state policy. Widespread Internet use has made the flow of information much easier and faster than in the past, increasing the ease of connecting not only policymakers, but also advocates and citizens (see Boushey 2010). For example, the Uniform Law Commission provides over 150 sample policies for states to use, as well as resources for states to learn about what other states and the federal government are adopting on the same topic. While fifty years ago, the organization would have to send representatives to state legislatures to advocate for policies, they can now hold nationwide virtual conferences and provide instant updates about new policies and adoptions. Websites for the NCSL, think tanks, non-profits, departments of commerce, industry organizations, and more provide legislative search engines across extensive policy areas. Not only do existing interest groups have lower organizational costs, but the growth of the Internet has democratized the process of organizing interests, which facilitated a massive growth in self-organizing groups that can advocate without being dependent on traditional organized interests (Shirky 2008). The Internet has changed how information spreads from state to state by increasing the amount of information available, and greatly reducing the cost of finding new information.

This leads us to two predictions. First, as broadband subscription rates become more prevalent in a state, states receive substantially more information from citizens, interest groups, and other states. There is a greater diversity of ideas and sources of information, as well as rapid knowledge of developments elsewhere. This should result in states being more innovative.

Hypothesis 1: States with higher broadband subscription rates are more likely to adopt a policy on average.

At the same time, broadband is expected to alter existing networks of information flows, by enabling people to easily communicate across geographies. As the cost to learn about what far away states are doing to tackle policy problems goes down, the role of geographic proximity should decrease. Citizens and elites can also be exposed to different policy changes through exposure on social media or other platforms and are more aware of what states across the country are doing than ever before (Hopkins 2018). This nationalized information environment should affect both voter and elite considerations away from local considerations and toward national issues (Trussler 2019), which is expected to reduce the role of neighboring state adoptions (Mallinson 2021; Mooney 2001). The growth of broadband has not only nationalized the information environment but made it easier for interests to disseminate information across large distances, and dramatically reduced the costs of forming advocacy groups on a national scale.

Hypothesis 2: Higher broadband subscription rates should reduce the effect of geographic proximity on state policy innovation over time.

Research Design

While single policy analyses play an important role in identifying diffusion processes and mechanisms, they come at the cost of potentially being a function of the specific policy being tested, which may lead to idiosyncratic findings. Seeking more generalizable results, our study uses a much larger dataset of state policy adoptions to test how broadband systematically affects the diffusion of policies across issue areas.⁴ To test our hypotheses, we use the SPID dataset (Boehmke et al. 2020). These data



Figure 1. Histogram of broadband subscription rates in the states (2000, 2005, 2010, and 2015). *Source.* American Community Survey and Current Population Survey.

include information on thousands of policy adoptions on hundreds of policies in all fifty states across a variety of policy areas from the 1800s through 2016. When merged with broadband subscription data, we examine over 1,600 adoptions of 105 policies, and over 26,000 total policystate-year observations from 2000 to 2016. This larger dataset of policies provides more confidence that the findings are not due to outlier policy issues, but rather reflect the broader diffusion environment. The dependent variable is a binary measure of whether a state adopted a policy in a given year.

Our key independent variable is a measure of broadband subscription rates in the states from 2000-2016 from the American Community Survey and Current Population Survey (including both mobile and fixed high-speed Internet connections).⁵ A broadband connection is defined as "having at least one type of Internet subscription other than a dial-up subscription alone" (Ryan 2018). Figure 1 shows the distribution of broadband subscription rates in the states over time. In the first time point, 2000, no state has more than 10 percent broadband usage rates. Subscription rates quickly rise to between 25 and 50 percent of the population having broadband subscriptions in 2005, and then to every state having over 60 percent subscriptions by 2015. While access to the Internet has rapidly spread across the entire country, there are still large differences between the

states, with gaps up to 25 percent between the states with the highest and lowest rates of broadband subscription.

An EHA is used to estimate the probability of a state adopting a policy over time, which allows us to model both the external and internal determinants of policy adoption (F. S. Berry and Berry 1990). A state becomes at risk of adopting a policy after any state adopts a given policy. So, if California adopts a policy, such as the coronavirus "stay-at-home order/self-quarantine," the other forty-nine states become at risk of adopting that policy each year until they adopt the policy. Once a state adopts a policy, it drops out of the risk set as it is no longer at risk of adopting the policy. Each policy has its own risk set, and an EHA models the probability of a state adopting a policy in a given year. We use an alteration of the EHA called the PEHA that follows Kreitzer and Boehmke's (2016) approach to pooling risk sets by including random intercepts for each policy; this method allows for pooling findings into a single, unified model while also recognizing that each policy has a distinct baseline probability of adoption.⁶

The key independent variable is a measure of the proportion of households that have broadband subscriptions in a state. The first model includes this variable in a typical model of state policy diffusion, with internal controls for legislative professionalism (Squire 2007)⁷, median income per capita, state population, percent Black in the population,⁸ a measure of unified party control, and public opinion ideological liberalism using Caughey and Warshaw's (2018) measure of mass public liberalism generated from a hundreds of public opinion surveys. Year fixed effects are used to account for year specific effects and a cubic polynomial for duration accounts for the time a state has been at risk of adopting a policy.⁹ Ideological polarization could lead states to take up new policies more quickly and be less reliant on geographic neighbors. To address this concern, we include a measure for the sum of the ideological distance (using Caughey and Warshaw's [2018] measure of policy liberalism) between a state and previously adopting states to control for the influence of ideological proximity; larger values represent larger ideological differences.

We include two measures for external influences on adoption, the first being a lagged count of neighboring states that previously adopted a policy. The second is Desmarais, Harden, and Boehmke's (2015) measure of decayed latent diffusion ties, which is an inferred network using previous policy adoptions to identify pathways in which policies persistently flow as they diffuse through the states. This is a powerful predictor of policy adoption that measures what states are frequently looked at for policy ideas. Once the pathways have been established, states continue to look to these source states for future policy solutions.

Results

The logistic regression coefficients in Table 1 (model 1) show how broadband subscription rates are associated with policy adoption from 2000 to 2016. The results show that both share borders/geographic continuity, and latent diffusion ties positively predict policy innovation over time, consistent with much of the previous literature. States are more likely to adopt a policy as the number of contiguous state adoptions increase, and as more states with latent ties adopt that policy. The only statistically significant controls are income per capita and legislative professionalism.¹⁰ The key independent variable, digital information access, as proxied by broadband subscription, also is associated with a higher probability of a state adopting a policy. These results support our first hypothesis that broadband access and use increases innovativeness across the state over time.

As a comparison, model 2 (Table 1) replicates the analysis for the earlier time period (1980–1999) as a control condition omitting broadband. It shows the counterfactual condition before the introduction of high-speed Internet access. Without including a measure of digital information access, the effect size for latent network ties and geographic continuity (neighboring states) are similar. Model 3 pools data for the complete time period (1980–2016) with broadband subscriptions set to zero before 2000. Broadband subscriptions remain a powerful predictor of policy adoptions, controlling for standard predictors of policy diffusion, including geographic continuity, latent ties, population size, liberal public opinion, and more educated populations. The effect size remains large.

Figure 2 shows the predicted probability of a state adopting a new policy in any given year at different rates of broadband subscriptions using the results from model 1. As the percentage of the population with broadband increases (across states and over time), so does the probability of a state innovating. The effect is substantively very large. The probability of innovation more than doubles from less than a 5 percent probability of adoption to over a 10 percent probability as a state's population goes from low to high levels of broadband subscriptions. A roughly 10 percent increase in broadband subscription results in a 1 percent increase in the probability of adoption. An increase of 1 percent is substantively very large when considering that the baseline probability of adopting a policy in any given year is just under 5 percent, particularly considering when the increase compounds each year. So, a 10 percent increase in broadband subscription rates increases the baseline probability of adoption by roughly 20 percent, and these positive effects compound over time.

As a robustness check we also subsampled our analysis to only include policies that were clearly non-ideological to test of partisan polarization is driving our results rather than broadband. We estimate the same models on only policies from the Uniform Law Commission, an organization that produces non-partisan model legislation. Our results hold for in terms of direction and significance for all of our hypotheses.

Our next set of models is the same specification, but with an interaction between broadband and previous contiguous state adoptions. This interaction allows a test if increased broadband subscriptions moderates the effect of contiguity on policy innovation.

The results in Table 2 include the interaction between geographic contiguity and broadband subscriptions to test Hypothesis 2. As in the previous table, both base terms for broadband subscription rates and contiguous adoptions predict policy innovation. However, the interaction between the two is negative and statistically significant across the three model specifications—(1) 2000–2016 time period (model 1), (2) pooled time period (model 2), and (3) pooled time period with additional binary variable for years before 2000 as an additional robustness check to isolate variation between the two eras (model 3). The negatively signed interaction indicates that higher broadband subscription rates decrease the association between geographic continuity and the probability of a state adopting a new policy.

	(1)	(2)	(3) Pooled 1980–2016
Broadband Subscriptions	1.7326**		0.7365**
	(0.6056)		(0.3600)
Latent Ties	0.0829***	0.1003***	0.1315***
	(0.0220)	(0.0113)	(0.0085)
Geographic Contiguity	0.1585***	0.1878***	0.1766***
	(0.0273)	(0.0178)	(0.0118)
Ideological Distance	-0.0040	-0.0062	-0.0081**
	(0.0052)	(0.0040)	(0.0028)
Population	0.0538	0.1235***	0.0994***
	(0.0356)	(0.0262)	(0.0180)
Public Liberalism	0.0351	0.1516***	0.1532***
	(0.0367)	(0.0346)	(0.0205)
Unified Party Control	0.0469	-0.0824**	-0.0143
,	(0.0552)	(0.0353)	(0.0253)
Income per Capita	-0.1043**	-0.0737*	-0.0677**
	(0.0424)	(0.0407)	(0.0240)
Legislative Professionalism	-0.0886*	-0.0955***	-0.1031***
	(0.0454)	(0.0288)	(0.0213)
Proportion Black	-0.0077	0.0088**	0.0080***
	(0.0156)	(0.0032)	(0.0024)
Percent High School	0.0116	0.0222***	0.0173***
	(0.0109)	(0.0048)	(0.0035)
Duration	-0.0227	-0.1954***	-0.0417**
	(0.0563)	(0.0305)	(0.0138)
Duration Squared	-0.0027	0.0292***	0.0016
	(0.0112)	(0.0045)	(0.0012)
Duration Cubed	0.0001	-0.0012***	-0.0000
	(0.0006)	(0.0002)	(0.0000)
Constant	-4.7559***	-3.6510***	-3.3370***
	(1.0185)	(0.4269)	(0.3147)
Var(Policy)	0.8403***	1.1815***	0.9534***
	(0.1328)	(0.1219)	(0.0794)
Observations	28.851	95.346	170.364

Table I. Pooled Event History Analysis of State Policy Innovations (2000–2016).

Modeling includes fixed effect for year and random effects for policy areas. More policies began diffusing in the 1980s and 1990s than those that began diffusing in the 2000s, so the number of observations is larger for the earlier period. Many of the policies from the 2000s are still diffusing, while most from the 1980s and 1990s are fully diffused. Broadband home subscription first measured by the Census Current Population Survey (CPS) in 2000. Internet use dial-up first measured by Census CPS in 1997. *p < .05. **p < .01. **p < .01.

Figure 3 shows the average marginal effect of geographic contiguity by broadband subscription rates on state policy adoptions (model 1, Table 2). The effect of contiguity is positive and statistically significant, as expected. Contiguous state adoptions increase the probability of adoption by roughly three-fourths of a percentage point with each additional contiguous adoption. However, the marginal effect of contiguity decreases as broadband subscription rates surpass 60 percent of the population. Contiguity no longer positively predicts policy adoption when subscription rates are over 85 percent. These results support our second hypothesis that broadband has altered flows of information and reduced the

role of geography in policy diffusion. States with high levels of digital information are less reliant on contiguous state adoptions for policy solution compared with states with low levels of broadband.

Instrumental Variable Regression (Two-Stage Causal Models)

Last, we estimate an instrumental variable model as a robustness check to demonstrate the relationship between the growth of digital information and the spread of diffusion of new policies is not spurious. This is necessary to address concerns about causality and endogeneity, and to

Figure 2. Predicted probability of adopting any given policy in a year.

Predicted probabilities are generated from the fixed component of the model and reflect the averaged random effects. Fixed effects are included for year.

strip out of the predictor variable, broadband subscriptions, any factors that might be unmeasured in our models. A two-stage probit uses three geographic variables (state geographic area, average elevation in a state, and Dobson and Campbell's [2014] measure of the percentage of a state's area that is flat) to predict rates of broadband subscriptions. These three geographic variables are predicted to predict broadband subscription rates but not policy innovation for multiple reasons (see supplemental appendix for a more detailed discussion of the instrumental approach and diagnostics used to test the instrument).

Simply put, people can only subscribe to broadband Internet if the infrastructure exists (i.e., broadband deployment). Without access to broadband cables, fiber, or wireless signals, people cannot sign up for a connection. Broadband lines are expensive to install, and largely privately funded. In larger states, Internet providers will have to devote more resources to cover geographically larger states. In addition, rugged terrain such as mountains increases the cost of installing lines for Internet access, so providers face more difficulties in installing broadband infrastructure. When geographic barriers to building broadband infrastructure are low, we expect broadband subscription rates to be higher. The second stage of the model includes the same variables we use in the other PEHAs, including contiguous adoptions, latent ties adoptions, policy liberalism, unified government control, state income per capita, legislative professionalism, and the percentage of the population with a high school degree. We also include a cubic polynomial for duration (years until a state adopts a policy), and fixed effects for state and year.

Table 3 shows the results for the two-staged probit model that treats broadband subscription rates as an

endogenous predictor of policy adoption. In the first stage of the model, larger states have lower levels of broadband subscription rates, and flatter states on average have higher rates of broadband subscription. States with an average higher elevation have somewhat higher rates of broadband subscription, although the difference is not substantively large. The other demographic variables behave as expected. Wealthy, well-educated, and populous states have higher levels of broadband access, while states with a larger minority population have lower rates of broadband subscriptions.

The second stage predicts policy adoption. Broadband subscription rates are a large, positive, and statistically significant predictor of policy adoption in the states. The predicted probability of adoption ranges from 4 percent for states with low levels of broadband subscriptions (below 20%) up to 7.6 percent for states with near universal levels of broadband (over 90%). The three percentage point increases in the probability of adoption is substantively large when considering the overall baseline probability of adoption is very low. Many of the other variables in the dataset behave as expected. Adoptions from contiguous states or states with latent ties increase the probability of adoption, and more populous states tend to be more innovative. Income per capita predicts higher levels of broadband subscription but not policy adoption, which provides further support for our argument that the relationship between broadband subscriptions and policy adoption is not spurious. Through a variety of specifications, we have shown that broadband is associated with higher levels of policy innovation across hundreds of adoptions of dozens of policies across diverse policy areas.

Discussion and Conclusion

For over fifty years, scholars have cited the central role of information in the spread of policies between U.S. states. We argue that the rapid growth of broadband has created more expansive policy adoption in states because it has dramatically increased the amount of information available while reducing the cost to access information, including a greater nationalization of information networks. Internet access and use facilitates rapid and lowcost communication across the world between interest groups, the citizenry, and states.

The empirical results reported here show that broadband subscription rates are positively associated with state government policy innovation. We expect that broadband is associated with higher rates of adoption through several mechanisms. One is through its influence on the public agenda, diversifying information sources, and increasing opportunities for citizens to easily convey preferences to policymakers. Another reason may be the



	(1)	(2)	(3)
	2000–2016	Pooled 1980-2016	Pooled pre-2000 dummy
Broadband Subscriptions	1.8702**	0.7211**	0.6893*
·	(0.6091)	(0.3597)	(0.3621)
Geographic Contiguity	0.3885***	0.2199***	0.2205***
6 7	(0.0999)	(0.0149)	(0.0153)
Broadband $ imes$ Geographic	-0.3478**	-0.1714***	-0.1649***
Contiguity	(0.1460)	(0.0364)	(0.0367)
Latent Ties	0.0753***	0.1273***	0.1325***
	(0.0222)	(0.0085)	(0.0087)
Ideological Distance	-0.0033	-0.0078**	-0.0079**
	(0.0052)	(0.0028)	(0.0028)
Population	0.0545	0.0994***	0.0998***
i opulation	(0.0355)	(0.0180)	(0.0182)
Public Liberalism	0.0291	0.1515***	0.1474***
	(0.0368)	(0.0205)	(0.0208)
Unified Party Control	0.0482	-0.0153	-0.0100
Onlined 1 arty Control	(0.0552)	(0.0254)	(0.0258)
Income per Capita	-0.1065**	-0.0673**	-0.0724**
	(0.0424)	(0.0240)	(0.0245)
Legislative Professionalism	-0.0865*	-01019***	-0.0998***
	(0.0453)	(0.0213)	(0.0216)
Proportion Black	-0.0084	0.0085***	0.0093***
Topol clon black	(0.0156)	(0.0024)	(0.0025)
Percent High School	0.0112	0.0182***	0.0197***
Fercent Figh School	(0.0109)	(0.0035)	(0.0035)
Duration	-0.0284	-0.0434**	-0.0500***
Duration	(0.0565)	(0.0138)	(0.0141)
Duration Squared	-0.0007	0.0020	0.0026**
Duration Squared	(0.0112)	(0.0012)	(0.0013)
Duration Cubod	0.0000	-0.0000	-0.0000
Duration Cubed	(0.0006)	-0.0000	-0.0000
Refere 2000	(0.0008)	(0.0000)	(0.0000)
Before 2000			-0.1396
Constant	4 5200***	2 22 1 2***	(0.4726)
Constant	-4.3298	-3.3217	
	(1.0255)	(0.3148)	(U.3043)
Var(Policy)	U.8475***		0.9 44 9***
	(0.1341)		(0.0793)
Observations	28,851	170,364	163,345

 Table 2.
 Pooled Event History Analysis of State Policy Innovations with Interaction between Geographic Contiguity and Broadband Subscriptions.

Modeling includes fixed effect for year and random effects for policy. **p < .01. ***p < .01.

Internet's impact on legislative information sources for policy alternatives. Following prior research in policy diffusion, these include bureaucratic processes drawing upon professional networks (Balla 2001; Mossberger 2000; Walker 1969), nationally connected interest groups and policy entrepreneurs (Kingdon 1995; Mintrom 2000), groundswells of public support (Boushey 2010; Pacheco 2012), and increased reliance on national media. We demonstrate that more widespread digital connectivity is associated with more innovativeness, and that its effect is substantively large, with a 10 percent increase in subscription being associated with an increase in the baseline probability of adopting a policy in a given year by roughly 20 percent. This relationship holds under other specifications including an instrumental variable approach that controls for factors that may cause both policy innovation and broadband subscriptions.

Broadband access not only appears to increase innovativeness but also alters information flows critical to policy innovation. States with high broadband usage are more likely to look beyond their immediate neighbors for policy solutions, and citizens and interest groups are

	Stage I	Stage 2
	Broadband subscriptions	Policy adoption
Broadband		4.3008***
Subscriptions		(1.0742)
Geographic Contiguity	-0.0003	0.0667***
0 I 0 ,	(0.0003)	(0.0147)
Latent Ties	-0.0003	0.0318**
	(0.0003)	(0.0120)
Ideological Distance	0.0003****	-0.0048*
0	(0.0001)	(0.0029)
Population	0.0035***	0.0303*
	(0.0004)	(0.0180)
Public Liberalism	0.0148***	-0.0346
	(0.0003)	(0.0230)
Unified Party Control	0.0087 ^{****}	-0.0034
,	(0.0005)	(0.0299)
Income per Capita	0.0335***	-0.1647***
	(0.0004)	(0.0414)
Legislative	-0.0044***	-0.0259
Professionalism	(0.0004)	(0.0232)
Percent High School	0.0022***	-0.0011
Ū	(0.0001)	(0.0065)
Proportion Black	0.0010***	-0.0061
	(0.0001)	(0.0074)
Duration	-0.0010	-0.0002
	(0.0007)	(0.0357)
Duration Squared	0.0001	-0.0033
	(0.0001)	(0.0054)
Duration Cubed	-0.0000	0.0001
	(0.0000)	(0.0003)
Geographic Area	-0.0161***	
	(0.0009)	
Flatness	0.0005***	
	(0.0000)	
Average Elevation	0.0000***	
C C	(0.0000)	
Constant	-0.2116***	-1.8436**
	(0.0100)	(0.6050)
Observations		27,689
Wald test of	11.63 (p < .001)	
exogeneity: χ^2	. /	

 Table 3. Instrumental Variable Regression: Two-Stage Probit

 with Broadband Treated as Instrumental Variable.

Modeling includes fixed effect for year and random effects for policy. *p < .05. **p < .01. ***p < .001.

increasingly able to mobilize in new ways as well as to operate within national networks. States with high levels of digital information are less reliant on neighboring states for policy ideas or other traditional sources of information. The decline in the importance of geographic continuity builds on recent studies pointing in the same direction, using different modeling and data (Bricker and LaCombe 2020; Desmarais, Harden, and Boehmke 2015;



Figure 3. Marginal effect of contiguity at different levels of broadband subscriptions (model 1).

Mallinson 2021). Broadband as an information and communications technology is distinct from other potential "resource" indicators for diffusion such as population and wealth. Unlike these variables, broadband not only is a resource for states to access more information, but this resource also alters the flow of information. As a robustness check, we estimated identical pooled event history models that interacted population and wealth with the neighbors variable and found that only broadband had a significant interaction with geographic contiguity.

These findings also help to explain both the growing innovativeness observed across all states (Boehmke and Skinner 2012) and the growing gap between the most and least innovative states. States with the highest broadband connectivity levels (in the North East and West Coast) are also among the most innovative as measured by innovation rate scores, while the least innovative states (Mississippi, Alabama, etc.) also have some of the lowest innovation rates (Boehmke et al. 2020). Our results suggest that the growing gap in broadband subscription rates is contributing to the growing gap between the most innovative and least innovative states.

Taken together, our findings suggest that widespread broadband use has changed how information spreads both among citizens and elites, leading to a greater number of new policies in states while also producing a more nationalized information network. While an aggregate study of policymaking cannot identify the exact processes promoting diffusion in the public and among policymakers across all these issues, accumulating bodies of research on the Internet's effects on the media, political participation, interest groups, and mobilization suggest a rich future research agenda on policy innovation in the states. Diffusion scholars should incorporate broadband subscription rates in models of diffusion because it represents an important way in which information and policy ideas circulate within states and between the states. An important next step would be to dive deeper into the role that broadband has within specific diffusion mechanisms such as learning, imitation, and competition.

This study is just first step in understanding how digital information affects policy diffusion. Future studies could evaluate whether broadband has a larger effect on information intensive diffusion mechanisms of learning and competition compared with imitation (Shipan and Volden 2008), and qualitative interviews with policymakers could also yield important insights into how the Internet has changed how they learn about policy solutions. In addition, digital information could have specific effects that differ by policy characteristics. Is diffusion, for example, more likely for policies with greater political salience and public attention, where a large proportion of the population has broadband? Or, are national influences more likely for policies with greater risk and uncertainty, as policymakers may be more motivated to engage in information search? These findings across thousands of policies, however, add to our confidence that digital information is a neglected aspect of the policy diffusion literature worthy of further exploration.

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Supplemental Material

Replication data and code can be found at https://scottlacombe. weebly.com/publications-and-working-papers.html. Supplemental materials for this article are available with the manuscript on the *Political Research Quarterly* (PRQ) website.

Notes

- 1. Following the tradition established in the literature, we define an innovation as a policy that is new to that state, even the policy was developed elsewhere (Walker 1969).
- We note these are not the only dynamics studied by scholars, as there is a robust debate on how to best develop and operationalize state policy diffusion mechanisms (see LaCombe and Boehmke 2019 for comprehensive reviews).
- 3. See Figure 1 for the distribution of broadband subscription rates across the states at different time points.

- 4. See supplemental appendix of summary statistics and graph on the number of observations and adoptions per year.
- 5. See supplemental appendix for example of question wording for broadband.
- 6. As a robustness check, we estimated models with fixed effects for policy and our findings remain the same. Broadband remains a powerful predictor of innovation and moderates the effect of contiguity in this specification.
- We also estimated parallel models with Bowen and Greene's (2014) measures for legislative professionalism. The model conclusions are unchanged.
- 8. We tried controlling for the size of the Latino population in a county and the results were unchanged.
- We estimated models with and without year fixed effects and the cubic polynomial and found broadband to have the same relationship with adoption in both significance and direction across models.
- 10. While single policy studies have often found legislative professionalism to positively predict innovation (F. S. Berry 1994; Shipan and Volden 2006), multiple policy analyses (Bricker and LaCombe 2020; Mallinson 2021) find legislative professionalism is negatively associated with innovation.

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