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Payments Evolution from Paper to Electronic: Bill Payments and Purchases

Joanna Stavins

Abstract:

Consumer payments in the United States gradually have been shifting away from paper checks for the past several years. Cash use has declined as well, although at a much slower pace. As the number of check payments has decreased, those payments have been replaced with electronic and card payments. However, the transition from paper to electronic and card payments for bills has not proceeded in the same way as the transition for purchases. Using detailed consumer survey panel data collected over nine years, we track the same respondents over time and find that consumers who reduced their check or cash use for bill payments in a given year were more likely to reduce their check or cash use for purchases in the following year; but a reduction in check or cash use for purchases was not followed by the use of fewer checks or less cash for bill payments. The results suggest that a change in bill payment behavior may be a precursor to payment behavior changes in general. These results may help predict changes in payment instrument use for various transaction types as new payment methods, such as faster payments or central bank digital currency, become available to consumers in the future.

JEL Classifications: D12, D14, D15

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This paper presents preliminary analysis and results intended to stimulate discussion and critical comment.

The views expressed herein are those of the author and do not indicate concurrence by the Federal Reserve Bank of Boston, the principals of the Board of Governors, or the Federal Reserve System.

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I. Introduction

Paper check use in the United States has declined over the past several years, both for paying bills and for making purchases. There is some evidence that replacing the remaining paper checks with electronic payments would lower transaction costs. For example, Álvarez et al. (2020) summarize the literature estimating the cost of various payment methods in several countries and show that checks are more expensive to process than electronic payments. Although there are no reliable recent estimates of the cost of check processing in the United States, there is some evidence that checks might be the most expensive payment method in this country (Garcia-Swartz et al. 2006) and in other countries (Stewart et al. 2014). While the transition to electronic processing of checks in the United States following the implementation of the Check Clearing for the 21st Century Act (Check 21) in 2004 lowered those processing costs (Humphrey and Hunt 2013), maintaining the check processing infrastructure remains costly.

High cost is only one reason why consumer payments have been shifting away from paper checks. Consumer payment choice is affected by several factors, both on the supply side and on the demand side (Stavins 2017). Convenience, budgeting, and acceptance are some of the other payment instrument attributes consumers value, and consumer preferences are highly heterogeneous (Schuh and Stavins 2010). Even if consumers opt to shift away from checks, merchants may prefer to accept checks rather than credit and debit cards, for which merchants are charged high processing fees (Felt et al. 2020). Despite the overall high cost of check processing, the direct cost to individual consumers writing a check or to small businesses accepting a check might be lower than the cost of alternative payment methods. In addition to consumer choice, an array of market forces influence payment evolution, including the provider market structure and regulatory changes (Rosenbaum et al. 2017).

Based on data from the Federal Reserve Payments Study (FRPS), the total number of check payments in the United States decreased 8.2 percent per year on average from 2015 through 2018 (FRPS 2020). From 2000 through 2018, the total number of checks, including those paid by businesses and government, plummeted from 42.6 billion to 14 billion, a 67 percent drop. During the same time period, the number of checks written by consumers fell from 19.3 billion to 7.1 billion, a 63 percent drop (FRPS; Figure 1). Despite the decline in check use over the past several years, the United States still has the largest number of checks as a share of

noncash payments in the world, according to a comparison of check use among 22 countries conducted by the Bank for International Settlements (BIS) in 2019 (Figure 2).

The number of cash payments in the United States also has decreased in recent years, but only slightly; the decline in cash use has not been nearly as large as the decline in check use. In fact, along with credit and debit cards, cash has been one of the top three payment instruments for consumers every year since at least 2008 (Foster et al. 2020). This is according to the Survey of Consumer Payment Choice (SCPC), a representative survey of US adults conducted annually by the Federal Reserve Banks of Boston and Atlanta that was initiated in 2008.

Most of the studies analyzing changes in the use of consumer payment methods over time rely on aggregate data. However, consumers have been shown to vary in terms of their payment behavior. For example, in one of the few papers analyzing the use of payment methods by demographic groups, Greene et al. (2020) use data from the 2017 and 2018 Diary of Consumer Payment Choice (DCPC)² and find that older, lower-income, or non-minority consumers are significantly more likely to pay with paper checks. Given such cross-sectional heterogeneity, it is reasonable to expect that the evolution from paper to electronic payments also would proceed differently across consumers.

In particular, consumers might change their payment behavior for bills and their behavior for purchases at different rates. Although there is evidence that check use has declined over time, there is little analysis in the literature of how changes in check use for bill payments and purchases relate to each other. This paper addresses the relationship between the evolution of bill payments and purchases. We use detailed survey data on consumer payment behavior over nine years to track individual consumers over time. Who shifted away from paper checks, and what did they substitute for checks? Did consumers reduce their check use for bills and then reduce it for purchases, or vice versa? Understanding which type of transactions has led the evolution from paper to electronic payments can help researchers and policymakers predict future changes, such as a potential transition to faster payments or to central bank digital currency when those payment options become available to consumers.

² The Diary of Consumer Payment Choice (DCPC) is a complementary survey to the SCPC filled out by the same set of respondents. In the DCPC, consumers record details of specific transactions (including dollar values) and their payment choices during a designated three-day period.

Consumers have multiple alternatives to checks for both types of transactions—they can pay bills automatically or online, and they can make purchases with a card, in person or remotely. While those options enable the transition away from check use, heterogeneous preferences and other differences among consumers generate disparities in their payment patterns.

The remainder of the paper is as follows. Section II describes the data used in the paper. Section III analyzes changes in payment instrument use by consumers over time for bill payments and purchases, with an emphasis on the decline in check and cash use. Section IV employs panel data regressions to estimate the effect of individual consumers' attributes on the use of payment instruments. Section V tests whether changes in bill payments influence changes in purchases or vice versa. Section VI examines geographic network effects on consumer payment behavior, and Section VII concludes.

II. Data

We use data from the Survey of Consumer Payment Choice (SCPC), which collects detailed information on consumer payment behavior, including adoption and use of payment instruments, bank account ownership, and cash holdings and withdrawals. It also collects consumer assessments of payment characteristics and a rich set of consumer and household demographic characteristics. Payment behavior includes adoption and use of the following payment instruments: cash, check, money order, credit card, debit card, prepaid card, and electronic payments out of a bank account (online banking bill pay [OBBP] and bank account number payment [BANP]). Respondents report their payment behavior in a typical month, including retail transactions for goods and services (both in person and online), bill payments, and person-to-person transactions. For more details on the SCPC and its design, see Schuh and Stavins (2014).

The SCPC was conducted using the RAND Corporation's American Life Panel (ALP) from 2008 through 2014. Since 2015, it has been conducted using the Understanding America Study (UAS), managed by the University of Southern California (USC) Dornsife Center for Economic and Social Research (CESR). Both panels are nationally representative of US consumers. Because the survey vendor changed, the sample changed after 2014. Starting in

2015, most of the respondents appear in the panel data for two or more consecutive years. Table 1 shows the number of respondents in each year, as well as the number of respondents who were also in the sample in the preceding year. For example, of the 3,153 respondents to the 2018 SCPC, 2,573 also took the 2017 survey (2,284 of them took both the 2016 and 2017 SCPC). For more details on recent survey data, see Foster et al. (2019), and for details on the methodology, see Angrisani et al. (2018).

Even though the SCPC data have been collected since 2008, the sample from that first year was very small, and one of the questions about the characteristics of payment instruments was added in 2010. Therefore, we include all the data in the summary statistics below but exclude the first two years of the survey from the regression analysis and use a panel of nine consecutive years of data, from 2010 through 2018.

III. Payment instrument use over time

In this section, we show changes in payment use for purchases and for bill payments by individual consumers to examine which payment methods replaced checks and which replaced cash for each type of transaction. The share of payments using instrument j in year t is calculated as the average of individual shares across all consumers:

$$S_{jt} = \frac{\sum_{i=1}^{N_t} s_{ijt}}{N_t}, \text{ where } s_{ijt} = \frac{N_{ijt}}{N_{it}}, \quad (1)$$

where N_t = number of consumers in year t , j = payment instrument, i = consumer, N_{ijt} = number of payments by consumer i using instrument j in year t , N_{it} = number of payments by consumer i in year t using all instruments ($N_{it} = \sum_j N_{ijt}$), and s_{ijt} = share of consumer i 's transactions conducted using payment instrument j in year t .

Table 2 shows the shares of transactions conducted with each payment instrument in each year, averaged across all consumers. The top panel of the table shows the average shares for all transactions (bills and purchases), while the bottom panel shows the average shares for bill payments. The average share of all transactions paid with checks dropped from 18 percent in 2008 to 5 percent in 2018. The average share of bills paid with checks fell from 30 percent in 2008 to 10 percent in 2018. The share of bills paid with checks was higher than the share of

purchases paid with checks, but the check share decreased faster for purchases than for bills: The share of check use for all bill payments dropped by two-thirds, while the overall check-use share dropped by almost three-quarters during the sample period. Checks continued to be used predominantly for paying bills: In 2018, 54 percent of checks were used to pay bills and 46 percent were used to make retail purchases (in person and online).

The drop in the check-use share for bill payments was offset by an increase in the shares of a few other payment instruments: the share of BANP for bill payments increased from 14 percent in 2009 to 22 percent in 2018; the share of payments by credit card rose from 12 percent in 2008 to 16 percent in 2018, and the share of payments by debit card increased from 19 percent in 2008 to 23 percent in 2018.

IV. Individual consumers' changes in payment use

Although check use declined over time for all consumers, the change was not uniform across age cohorts. Check use declined more for older and middle-aged consumers, while it remained low and relatively steady for the youngest (under 25) and second youngest (25 to 34) age groups (Figure 3). The order across age cohorts did not change throughout the period: Check use remained highest for the oldest group (65 and older) and lowest for the youngest group, but the dispersion among age cohorts diminished substantially. The decline was more uniform across income and education cohorts (Figure 4 and Figure 5).

Changes in the rate at which checks were used for bill payments reflect the changes in total check use. Both for bills and for all transactions (bills and purchases combined), the oldest consumers experienced the biggest drop in check-use share, but their share remained greater than the check-use share of any other age group (Figure 6).

1. Model of consumer payment use

The high rate of check use by the oldest consumers could indicate that as consumers age, they start using checks more extensively. Alternatively—and more likely—a particular cohort of consumers might use checks more extensively throughout their lifespan, and we observe them in the data when they are 65 years old or older. Payment habits are persistent, and adopting new technology is costly. The older generation of consumers had fewer options when they developed their payment habits (cash and checks), and therefore it might take them longer to switch to other

instruments. Younger generations enter the financial markets having more choices, and they can start with the most convenient method of payment because they do not have to bear switching costs. Thus 65-year-old consumers at the beginning of the sample period might have payment habits that are different from those of 65-year-old consumers at the end of the sample period.

Having access to almost a decade of data allows us to separate the effect of a consumer's age from the effect of calendar years on the use of each payment method. Using panel data on individual US consumers' payment behavior from 2010 through 2018 and controlling for demographic and income attributes of every consumer, we estimate how the use of each payment instrument changed over time. To estimate the effect of time, we include dummy variables for each year of the sample.

We regress the share of payment instrument j for consumer i in year t , s_{ijt} , on demographic attributes, income, characteristics of payment instruments, and year dummies. We estimate the share of all payments, bills, and purchases separately. Coefficients on the year dummies are then used to calculate the average annual change in shares over time, controlling for demographics and income of individual consumers.

$$s_{ijt} = s(DEM_{it}, INC_{it}, CHAR_{ijt}, YEAR_t, \varepsilon_{ijt}), \quad (2)$$

where s_{ijt} is a share of payment instrument j for consumer i in year t , DEM_{it} is a vector of demographic attributes for consumer i in year t (age or birth year cohort, education, race, gender), INC_{it} is a set of income and financial variables for consumer i in year t (income, employment status, homeownership), $CHAR_{ijt}$ is a vector of characteristics of payment instrument j for consumer i in year t (cost, convenience, record keeping, and security), $YEAR_t$ is a set of year dummy variables ($t = 2010, \dots, 2018$; 2014 omitted as the reference year), and ε_{ijt} is an error term. Including state fixed effects in the regression does not affect the results significantly. Because the state of residence variable is not available for all the years of the survey, we do not include those fixed effects in the final specification shown here.

To test whether the age effects differ from the generation effects, we estimate three different specifications: one with age and age squared, one with a set of dummy variables for age cohorts, and one with a set of dummy variables for each decade-long birth year cohort.³

Previous studies find that payment instrument characteristics are significant in estimating consumer payment behavior, even when controlling for demographic and financial attributes of each consumer (Schuh and Stavins 2010, 2013). Previous studies also find that the explanatory power of characteristics (assessments) of payment instruments exceeds the explanatory power of demographic attributes. The payment method characteristics in our model are:

$$CHAR = \{COST, CONVENIENCE, RECORD\ KEEPING, SECURITY\}.$$

Consumers assess each of these characteristics for each payment method and rate it on a 1–5 scale. We are interested in consumers' rating of each payment instrument j relative to all the other payment instruments j' . Therefore, for each characteristic k , we use log relative characteristics as explanatory variables,

$$RCHAR_{ki}(j, j') \equiv \log\left(\frac{CHAR_{kij}}{CHAR_{kij'}}\right),$$

where k indexes the characteristic's cost, convenience, record keeping, and security; i indexes the consumer; and j is the payment instrument. In principle, all of the relative characteristics could influence a consumer's choice of any payment instrument. However, to facilitate the interpretation of the marginal effects of the characteristics on payment instrument use, we construct the average relative characteristic for each payment characteristic,

$$\overline{RCHAR}_{ki}(j) = \frac{1}{J} \sum_{j' \neq j}^{J-1} RCHAR_{ki}(j, j'),$$

where J = all of the payment instruments. For example, \overline{RCHAR} for cost in the check-use equation is the average of the log ratios of the cost of the check use to the cost of each of the other payment instruments. It measures how a consumer evaluates the cost of using checks relative to the cost of all of the other payment methods. There is substantial variation in the relative characteristics across consumers. Security and convenience have especially large

³ Because our panel is not balanced, we cannot follow each individual over the nine-year span of the data.

variation, indicating that these numerical measures are subjective to some extent. We expect the coefficients on all of the average relative characteristics to be positive, because a greater numerical value of *CHAR* indicates a more positive assessment by a consumer, and we assume that consumers value all of the characteristics.

2. Results

Table 3a shows the results of the panel data regressions for each payment instrument with *age cohorts*, while Table 3b shows the results with *birth year cohorts*. Table 4 shows the average year-to-year changes in individual consumers' shares for each payment instrument, calculated from the year dummy coefficients estimated in equation (2) and shown in Table 3a. Although our focus is on the evolution of check use, the use of other payment instruments changed over time as well.

Year effects: After controlling for age, other demographics, and income, we find that the average share of check payments decreased every year, with statistically significant drops from the years 2010 to 2014, from 2016 to 2017, and from 2017 to 2018. It also decreased from 2014 to 2015 and from 2015 to 2016, although the coefficients for those two declines are not statistically significant. The annual decrease ranges from 0.3 percentage point in 2018 to 1.4 percentage points in 2011. Cash use declined as well: After we control for demographics and income, the share of cash payments dropped significantly every year except for 2015 and 2017, with the decreases ranging from 0.1 to 2.4 percentage points. The drop in the shares of cash use and check use was offset by an increase in the shares of the use of debit cards (in 2011, 2013, 2014, 2016, and 2018), prepaid cards (in 2016, 2017, and 2018), credit cards (in 2013 and 2014), and BANP (in 2013 and 2018).

Age and generation effects: Regardless of whether we include age and age squared, age cohort, or birth year cohort in the regression, the effect on check use is significant. All three specifications indicate that older consumers use checks more extensively than younger consumers do. Relative to the omitted category, consumers who were older (by age or by birth year) used checks more, while consumers who were younger (by age or by birth year) used checks less. In particular, consumers over 65 had a 4.3 percentage point higher check-share use and those aged 55 to 64 had a 1.7 percentage point higher check-share use, on average, compared

with the omitted category of those aged 45 to 54. Consumers born before 1945 had a 7-percentage point higher check-share use and those born between 1945 and 1954 had a 3.7 percentage point higher check-share use compared with the omitted category of those born between 1965 and 1974. The generational effects are greater in magnitude than the age effects, although because the cohorts are not lined up exactly, drawing such conclusions might be misleading. It is possible that a longer time series would reveal even stronger generational effects compared with the age effects. The results suggest that both generational effects and age effects influence check use. Moreover, the year effects remain unchanged in each of the three specifications when we control for either the age or birth year cohort.

Demographic and income effects: The regression results show that coefficients on demographic and income attributes are highly significant and much greater in magnitude than the year effects, reflecting the substantial heterogeneity across consumers in their use of payment methods. Moreover, the significant differences across demographic and income cohorts persisted over time despite the transition from paper payments to electronic and card payments. In particular, older, less educated, lower income, Black, or unemployed consumers used cash more frequently than their counterparts. Consumers who are lower income, white, employed, or homeowners used more checks than their counterparts. Compared with consumers with a graduate school education, consumers with less than a high school education or a high school education had a cash-use share that was 17 percent higher and 7 percent higher, respectively. Unemployed consumers had a 7.9 percent higher cash-use share than employed consumers, but a 2.1 percent lower check-use share. Consumers with an annual household income of less than \$25,000 had a 10 percent higher cash-use share and a 1 percent lower check-use share than consumers with an annual household income of more than \$100,000. Men had a 4.5 percent higher cash-use share and a 0.9 percent lower check-use share compared with women.

Credit card use was strongly affected by education and income. Consumers with less than a high school education or a high school education had a credit-card-use share that was 14.5 percent and 11.5 percent lower, respectively, compared with those who have a graduate school education, controlling for income. Consumers in the lowest income cohort (less than \$25,000 annually) had a credit-card-use share that was 9.5 percent lower than those in the highest income cohort (more than \$100,000 annually). Less educated consumers and lower income consumers

used debit cards more extensively than their counterparts. The lowest income consumers and least educated consumers used prepaid cards more extensively, possibly reflecting the use of prepaid cards for social benefit programs.

Employment and homeownership significantly affected payment method use, even when we control for income and demographic attributes. Homeowners had higher shares of use of the instruments used for paying bills—check, OBBP, and BANP—and lower shares of use of cash, debit, and prepaid cards. Compared with employed consumers, unemployed consumers more extensively used payment instruments that are not linked to a bank account—namely cash and prepaid cards.

Bills versus purchases: Separating bill payments and purchases shows that check use declined over time for both types of transactions. Table 5 shows that the share of check use for bill payments fell by 0.7 to 3.5 percentage points each year, after we control for demographic and income attributes. The corresponding drop in the check-use share for purchases was much less noticeable—0.4 to 1.3 percentage points. However, there is no obvious sequential pattern in the decrease in the check-use share. Because the check-use share decreased almost every year for both bills and purchases, it is not obvious from these estimates which type of transaction was the leader and which one followed. Similarly, the cash-use share moved in the same direction for both bills and purchases, leaving no clear indication whether changes in bill payment behavior preceded changes in purchase behavior or vice versa. In the section below, we track individual consumers over time to test whether they reduced their check-use or cash-use share for bill payments first or for purchases first.

V. Changes in purchases and bill payments: Which is the leader?

Consumers may decrease their reliance on paper—checks or cash—for one type of transaction, and that change could in turn affect their payment behavior for another type of transaction. In this section, we examine whether such network effects in payment behavior exist. In particular, we test whether changes in payment behavior for purchases help predict changes in payment behavior for bills, whether the opposite is observed—a drop in check use or cash use for bill payments helps predict future changes in payment behavior for purchases—or whether the

payment behaviors move independently of each other. Do consumers reduce their check use for bills and follow with a similar change for purchases, or vice versa?

In addition to consumer preferences, the supply side may play an important role in payment choice. For example, broader acceptance of electronic bill payments or of debit and credit cards may induce a decline in the use of checks. Because the data do not allow us to separate such supply-side effects from demand-side effects, shifts in payment behavior do not imply causality. We limit this part of our analysis to three consecutive years: 2016, 2017, and 2018. Those years had the largest samples and the greatest number of respondents who remained in the panel for consecutive years (Table 1). More than 80 percent of the respondents were in the sample for two consecutive years, and almost three-fourths (2,284 respondents) stayed in the sample for all three years.

Although many consumers reduced their check use or cash use from one year to the next, a similar number increased their use of these payment instruments (see Table 6). However, the magnitude of the declines differed: While the average drop in check use for bills was 15 percentage points in 2017 and 14 percentage points in 2018, the corresponding drop in check use for purchases was only 9 and 10 percentage points, respectively. For cash, the average declines in use for bill payments and use for purchases were very similar.

Table 7a shows demographic attributes and income for consumers who reduced their check use or cash use from the years 2016 to 2017, and Table 7b shows the same statistics for those who reduced their check use or cash use from 2017 to 2018. Although the decline in cash use was more evenly distributed across income and demographic cohorts, especially from 2016 to 2017, the decline in check use was not: Older, more educated, or higher income consumers were most likely to reduce their check use, both for bills and for purchases. In 2017, the youngest consumers were most likely to decrease their cash use for both purchases and bill payments, and the highest educated consumers were most likely to reduce their cash use for purchases. The lowest income consumers were most likely to decrease their cash use for bill payments in both years.

Do changes in bill payment behavior precede changes in purchase behavior, or vice versa? We look at the consumers who reduced their check use for bills from 2016 to 2017 and test whether that drop was followed by a decline in their use of checks for purchases the

following year. There is some (weak) evidence that bill payments led changes in consumers' payment behavior: People who reduced their check use for bills one year decreased their use of checks for purchases the following year. Table 8 shows that consumers who reduced their check use for bill payments from 2016 to 2017 (33.9 percent of the sample) reduced their check-use share by 14.5 percentage points on average. Those consumers then decreased their check use for purchases in the following year, from 2017 to 2018, although by only 0.6 percentage point on average. In contrast, consumers who reduced their check use for purchases from 2016 to 2017 (30.6 percent of the sample) *increased* their check use for bills the following year, albeit by only 0.5 percentage point on average. This indicates that bill payment behavior influences purchase payment behavior, but not the other way around.

There is similar evidence regarding cash use (Table 9): Consumers who reduced their cash-use share for bill payments from 2016 to 2017 (20.1 percent of the sample, with an average drop in cash-use share of 20.7 percentage points), subsequently decreased their cash-use share for purchases the following year, by 0.8 percentage point on average. Consumers who reduced their cash-use share for purchases (44.1 percent of the sample, with an average drop in cash-use share of 18.6 percentage points) *increased* their share of cash use for bill payments the following year, by 1.2 percentage points on average.

Based on the panel of consumers who were in the sample for three consecutive years, changes in bill payment behavior led to subsequent changes in purchase payment behavior. Specifically, consumers who reduced their check use or cash use for bills decreased their check use or cash use for purchases the following year.

VI. Geographic network effects

1. Cross-sectional geographic effects

We examine geographic areas to test whether consumers who use electronic bill payments more extensively tend to cluster together. For example, there may be some cultural differences across states that may be relevant for payment habits. Figure 7 shows the geographic distribution of average shares of electronic bill payments by state. States that have the highest shares of bills paid electronically tend to be either those with low density of population or smaller East Coast states with a more educated or higher income population.

To test whether the frequency of use of electronic payments is correlated with population density and/or with per capita income, we merge state-level per capita income and population density measures with the SCPC data. Although per capita income and population density are positively correlated with the average use of electronic payments for bills across states (electronic bill payments as a share of all bill payments), the correlation coefficients are very low: 0.04 for per capita income and 0.03 for population density. Thus, there is no evidence that consumers living in states with higher average per capita income or higher population density pay their bills electronically at a higher rate on average than consumers living in other states.

2. *Intertemporal change in payment behavior*

We continue our analysis of panelists who participated in the sample in three consecutive years—from 2016 through 2018—to test whether the patterns observed at the individual consumer level also exist at the state level. Intertemporal geographic analysis by state shows that states that had higher average shares of bills paid electronically in 2016 had lower shares of transactions made using paper instruments—cash and checks—the following year (Table 10, left column). Correlation coefficients between the share of bills paid electronically in 2016 in a given state and the share of check or cash payments in 2017 in that state were negative and ranged from -0.15 to -0.48 . The negative correlation was especially high for check-use shares, indicating that paying bills electronically may induce a shift from checks for all types of transactions, including purchases. Similarly, states that had higher shares of bills paid electronically in 2017 had lower shares of cash and check payments in 2018, except for the share of purchases paid with checks.

Looking at year-to-year *changes* in shares at a state level (Table 10, right column), states that had a larger increase in the average share of bills paid electronically in a given year were more likely to have a larger decline in the share of purchases paid with cash (in 2017) or with checks (in 2018).

The connection at the state level is not very strong, but there is some indication that changes in bill payment habits—shifting from paper payment instruments to electronic payments—may be a leading indicator of changes in payment behavior in general, including shifting away from paper payment instruments for purchases.

VII. Conclusion

The evolution of consumer payments in the United States away from paper instruments—checks and cash—has been documented for several years. The change has been especially pronounced for the use of checks, which has declined significantly over the past two decades. This paper analyzes the shift away from paper payment instruments for bills and purchases and shows some evidence that bill payment behavior leads to changes in payment behavior in general, including changes in purchases. Consumers who reduced their use of checks or cash for bills were more likely to subsequently reduce their use of checks or cash for purchases, but not the other way around.

Several factors affect consumers' choice of payment instruments. Lack of acceptance of electronic bill payments may be one obstacle preventing consumers from reducing their check use even further. But in light of possible future developments in consumer payment choices, such as the availability of new payment options including faster payments or central bank digital currency, understanding which types of transactions consumers change first might help predict future shifts from paper to electronic payments. Because checks are costly to process, facilitating a faster transition from checks to electronic payments for bills might help disseminate that transition to all types of transactions, including purchases.

This paper analyzes the evolution of consumer payments from paper to electronic during the pre-pandemic period. Future research will extend the data to examine the effect of the pandemic on the shift from paper to electronic payments and will analyze the heterogeneity among merchant types.

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Table 1: Number of respondents and number of repeat respondents, by year

Year	Number of Respondents	Number of Respondents Who Participated in the Previous Year
2010	2091	--
2011	2124	1779
2012	2041	1893
2013	2071	1320
2014	1220	0
2015	1411	903
2016	3404	1050
2017	3099	2681
2018	3153	2573

Source: Survey of Consumer Payment Choice, various years.

Table 2: Average shares by payment instrument by year, percent of all transactions

	2008	2009	2010	2011	2012	2013	2014	2015	2016	2017	2018
Share of All Transactions											
Cash	22.9	29.3	30.2	29.1	29.5	28.3	26.2	28.9	28.3	28.5	25.1
Check	17.6	14.0	11.5	10.8	10.2	9.8	7.8	7.1	7.4	6.1	5.4
Money order	1.3	2.0	1.4	1.2	1.4	1.2	1.1	0.8	1.0	1.1	1.2
Credit	19.6	15.6	16.7	17.3	18.0	19.0	18.5	19.7	19.4	21.2	22.0
Debit	27.3	26.4	27.2	28.5	28.1	28.7	33.0	30.0	30.0	29.3	30.2
Prepaid	0.6	1.6	1.3	1.3	1.5	1.6	1.6	1.8	2.5	2.9	3.5
OBBP	3.7	5.1	4.8	5.1	5.0	4.6	4.5	4.1	4.2	3.7	3.8
BANP	--	5.2	5.6	5.7	5.4	5.9	6.2	6.7	6.3	6.1	7.9
Income	--	0.8	1.2	1.1	0.9	1.0	1.2	0.9	1.0	1.0	0.9
Traveler's checks	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	--
Electronic bank account deduction (2008)	8.8	--	--	--	--	--	--	--	--	--	--
Share of Bills											
Cash	7.7	12.3	11.7	12.3	11.8	12.1	10.1	11.7	11.9	12.5	10.6
Check	29.8	22.7	21.4	19.0	17.4	16.5	13.8	12.5	13.0	10.8	9.8
Money order	2.3	3.9	2.7	1.8	2.6	2.0	2.4	1.7	1.6	1.7	1.5
Credit	12.2	10.1	11.4	13.1	13.5	14.9	13.9	14.7	14.8	16.2	15.9
Debit	18.6	18.4	19.9	21.1	22.6	22.8	24.4	24.8	23.5	23.3	23.1
Prepaid	0.2	0.9	0.9	1.0	1.2	1.1	1.3	1.6	2.3	3.1	3.3
OBBP	10.7	15.0	14.1	13.6	13.4	13.0	14.2	12.5	11.9	11.7	11.5
BANP	--	13.7	15.0	15.0	15.1	15.2	16.6	18.1	18.1	17.7	21.7
Income	--	2.9	2.9	3.1	2.4	2.5	3.2	2.5	2.9	3.0	2.6
Number of consumers participated	1000	2160	2091	2124	2041	2071	1220	1411	3404	3099	3153

Notes: sampling weights were applied to all statistics.

The share of payments using instrument j is calculated as:

$$S_j = \frac{\sum_{i=1}^N s_{ij}}{N}, \text{ where } s_{ij} = \frac{N_{ij}}{N_i}$$

N = Number of consumers; j = Payment instrument; i = consumer; N_{ij} = Number of payments by consumer i using instrument j ;

N_i = Number of payments by consumer i using all instruments.

Table 3a: Payment instrument use regressions (share of all payments), age cohorts

		Cash	Check	Credit	Debit	BANP	OBBP	Prepaid
Age	<i>Under 25</i>	0.009	-0.023 ***	-0.005	0.042 ***	-0.012 ***	-0.015 ***	-0.011 ***
	<i>25 - 34</i>	-0.042 ***	-0.017 ***	0.016 ***	0.034 ***	-0.003	-0.013 ***	0.006 ***
	<i>35-44</i>	-0.022 ***	-0.014 ***	0.008	0.017 ***	-0.003	-0.004 *	0.008 ***
	<i>45-54</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
	<i>55-64</i>	-0.009 *	0.017 ***	0.012 ***	-0.015 ***	-0.001	0.007 ***	-0.003 *
	<i>Over 65</i>	-0.021 ***	0.043 ***	0.044 ***	-0.051 ***	0.004	0.006 **	-0.011 ***
Education	<i>Less Than High School</i>	0.168 ***	0.006	-0.144 ***	0.003	-0.011 ***	-0.006 *	0.012 ***
	<i>High School</i>	0.069 ***	0.015 ***	-0.113 ***	0.059 ***	0.000	-0.004 **	0.004 **
	<i>Some College</i>	0.028 ***	0.007 **	-0.105 ***	0.076 ***	0.005 ***	0.002	0.005 ***
	<i>College</i>	-0.001	0.003	-0.033 ***	0.031 ***	0.003	0.005 **	-0.002
	<i>Graduate</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Gender	<i>Male</i>	0.044 ***	-0.008 ***	0.011 ***	-0.032 ***	-0.011 ***	-0.006 ***	-0.004 ***
	<i>Female</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Income	<i>Less than \$25,000</i>	0.100 ***	0.010 ***	-0.095 ***	0.023 ***	-0.009 ***	-0.013 ***	0.018 ***
	<i>\$25,000-\$49,999</i>	0.032 ***	0.018 ***	-0.080 ***	0.069 ***	0.002	-0.010 ***	-0.002
	<i>\$50,000-\$74,999</i>	0.007	0.017 ***	-0.054 ***	0.062 ***	0.005 **	-0.008 ***	-0.005 ***
	<i>\$75,000-\$99,999</i>	-0.004	0.005 *	-0.041 ***	0.065 ***	0.002	-0.008 ***	-0.004 **
	<i>More than \$100,000</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Ethnicity	<i>Latino</i>	0.023 ***	-0.012 ***	-0.037 ***	0.030 ***	0.003	0.005 **	-0.002
	<i>Non-Latino</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Race	<i>Black</i>	0.041 ***	-0.015 ***	-0.047 ***	0.013 **	0.009 ***	0.007 ***	0.012 ***
	<i>Asian</i>	-0.028 ***	-0.016 ***	0.150 ***	-0.111 ***	-0.002	0.009 **	0.001
	<i>Other</i>	0.036 ***	-0.013 ***	-0.019 **	0.002	-0.003	-0.002	0.002
	<i>White</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Home Ownership	<i>Homeowner</i>	-0.041 ***	0.023 ***	0.034 ***	-0.024 ***	0.010 ***	0.012 ***	-0.015 ***
	<i>Non-homeowner</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Work Status	<i>Unemployed</i>	0.077 ***	-0.022 ***	-0.003	-0.051 ***	-0.013 ***	0.000	0.016 ***
	<i>Retired</i>	-0.002	-0.009 ***	0.050 ***	-0.041 ***	-0.007 ***	0.004 *	0.005 **
	<i>Disabled or other</i>	0.006	-0.005 *	0.021 ***	-0.034 ***	-0.003	-0.004 **	0.012 ***
	<i>Employed</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Relative Characteristics	<i>Cost</i>	0.043 ***	0.015 ***	0.113 ***	0.118 ***	0.018 ***	0.024 ***	0.006 ***
	<i>Convenience</i>	0.085 ***	0.072 ***	0.093 ***	0.167 ***	0.020 ***	0.041 ***	0.013 ***
	<i>Records</i>	0.035 ***	0.024 ***	0.085 ***	0.092 ***	0.013 ***	0.020 ***	0.011 ***
	<i>Security</i>	0.017 ***	0.024 ***	0.035 ***	0.035 ***	0.004 ***	0.016 ***	0.001
Year FE	<i>2010</i>	0.043 ***	0.045 ***	-0.013 *	-0.040 ***	0.000	0.003	0.001
	<i>2011</i>	0.042 ***	0.031 ***	-0.016 **	-0.027 ***	-0.001	0.009 ***	0.003
	<i>2012</i>	0.032 ***	0.021 ***	-0.020 ***	-0.046 ***	-0.009 **	-0.001	0.002
	<i>2013</i>	0.020 **	0.013 ***	-0.014 *	-0.036 ***	-0.003	0.000	-0.001
	<i>2014</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
	<i>2015</i>	0.026 ***	-0.005	0.000	-0.028 ***	0.000	-0.003	0.004
	<i>2016</i>	0.025 ***	-0.003	-0.006	-0.026 ***	0.000	-0.004	0.011 ***
	<i>2017</i>	0.039 ***	-0.012 ***	-0.002	-0.035 ***	-0.003	-0.011 ***	0.015 ***
	<i>2018</i>	0.015 **	-0.016 ***	-0.016 **	-0.017 *	0.018 ***	-0.010 ***	0.017 ***
Adjusted R-Squared		0.1852	0.1796	0.3057	0.1845	0.0438	0.1056	0.0748
Number of Observations		19995	19992	19988	19984	19979	19989	19976

Source: Survey of Consumer Payment Choice, 2010–2018.

Table 3b: Payment instrument use regressions (share of all payments), birth year cohorts

		Cash	Check	Credit	Debit	BANP	OBBP	Prepaid
Birth year	<i>Before 1945</i>	-0.014 *	0.070 ***	0.052 ***	-0.090 ***	0.007 **	0.002	-0.011 ***
	<i>1945-1954</i>	0.000	0.037 ***	0.029 ***	-0.046 ***	0.003	0.003	-0.008 ***
	<i>1955-1964</i>	0.005	0.020 ***	0.009 *	-0.031 ***	0.004 **	0.003	-0.003
	<i>1965-1974</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
	<i>1975-1984</i>	-0.021 ***	-0.006 **	0.011 **	0.002	0.001	-0.009 ***	0.008 ***
	<i>1985-1994</i>	-0.019 ***	-0.007 *	0.014 **	0.021 ***	-0.005 *	-0.018 ***	-0.002
	<i>After 1994</i>	0.052 ***	-0.018 *	-0.019	0.009	-0.013 *	-0.018 **	0.004
Education	<i>Less Than High School</i>	0.170 ***	0.006	-0.145 ***	0.003	-0.011 ***	-0.006	0.012 ***
	<i>High School</i>	0.070 ***	0.015 ***	-0.113 ***	0.060 ***	0.000	-0.005 **	0.004 *
	<i>Some College</i>	0.029 ***	0.007 **	-0.105 ***	0.076 ***	0.005 **	0.002	0.004 **
	<i>College</i>	-0.001	0.003	-0.033 ***	0.031 ***	0.003	0.005 **	-0.002
	<i>Graduate</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Gender	<i>Male</i>	0.044 ***	-0.008 ***	0.011 ***	-0.032 ***	-0.011 ***	-0.006 ***	-0.004 ***
	<i>Female</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Income	<i>Less than \$25,000</i>	0.100 ***	0.010 ***	-0.095 ***	0.024 ***	-0.009 ***	-0.012 ***	0.017 ***
	<i>\$25,000-\$49,999</i>	0.031 ***	0.018 ***	-0.080 ***	0.070 ***	0.002	-0.010 ***	-0.002
	<i>\$50,000-\$74,999</i>	0.006	0.017 ***	-0.054 ***	0.062 ***	0.005 **	-0.007 ***	-0.005 ***
	<i>\$75,000-\$99,999</i>	-0.005	0.005 *	-0.040 ***	0.065 ***	0.002	-0.008 ***	-0.004 **
	<i>More than \$100,000</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Ethnicity	<i>Latino</i>	0.023 ***	-0.013 ***	-0.036 ***	0.030 ***	0.003	0.005 *	-0.002
	<i>Non-Latino</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Race	<i>Black</i>	0.042 ***	-0.015 ***	-0.047 ***	0.013 *	0.009 ***	0.006 ***	0.012 ***
	<i>Asian</i>	-0.028 ***	-0.016 ***	0.152 ***	-0.112 ***	-0.002	0.008 *	0.001
	<i>Other</i>	0.037 ***	-0.012 **	-0.018 **	0.001	-0.003	-0.002	0.002
	<i>White</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Home Ownership	<i>Homeowner</i>	-0.040 ***	0.023 ***	0.033 ***	-0.024 ***	0.010 ***	0.012 ***	-0.014 ***
	<i>Non-homeowner</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Work Status	<i>Unemployed</i>	0.077 ***	-0.021 ***	-0.003	-0.052 ***	-0.013 ***	0.000	0.015 ***
	<i>Retired</i>	-0.004	-0.013 ***	0.050 ***	-0.036 ***	-0.006 **	0.006 ***	0.004 *
	<i>Disabled or other</i>	0.005	-0.005 **	0.021 ***	-0.033 ***	-0.003	-0.004 **	0.012 ***
	<i>Employed</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
Relative Characteristics	<i>Cost</i>	0.043 ***	0.015 ***	0.113 ***	0.117 ***	0.018 ***	0.024 ***	0.006 ***
	<i>Convenience</i>	0.085 ***	0.071 ***	0.094 ***	0.166 ***	0.020 ***	0.041 ***	0.012 ***
	<i>Records</i>	0.035 ***	0.024 ***	0.085 ***	0.092 ***	0.013 ***	0.020 ***	0.011 ***
	<i>Security</i>	0.017 ***	0.024 ***	0.035 ***	0.035 ***	0.004 ***	0.016 ***	0.001
Year FE	<i>2010</i>	0.044 ***	0.038 ***	-0.018 **	-0.032 ***	-0.001	0.002	0.002
	<i>2011</i>	0.043 ***	0.026 ***	-0.019 **	-0.021 **	-0.002	0.008 **	0.003
	<i>2012</i>	0.033 ***	0.018 ***	-0.023 ***	-0.041 ***	-0.009 ***	-0.001	0.003
	<i>2013</i>	0.021 ***	0.011 **	-0.015 *	-0.034 ***	-0.003	0.000	0.000
	<i>2014</i>	-- --	-- --	-- --	-- --	-- --	-- --	-- --
	<i>2015</i>	0.027 ***	-0.004	0.000	-0.029 ***	0.000	-0.003	0.004
	<i>2016</i>	0.026 ***	-0.001	-0.004	-0.030 ***	0.001	-0.003	0.010 ***
	<i>2017</i>	0.039 ***	-0.008 **	0.000	-0.041 ***	-0.002	-0.010 ***	0.014 ***
	<i>2018</i>	0.014 *	-0.010 **	-0.013 *	-0.025 ***	0.019 ***	-0.009 ***	0.016 ***
Adjusted R-Squared		0.1840	0.1820	0.3055	0.1855	0.0439	0.1055	0.0738
Number of Observations		19996	19993	19989	19985	19980	19990	19977

Source: Survey of Consumer Payment Choice, 2010–2018.

Table 4: Year-to-year changes in shares, controlling for demographics and income (based on shares regressions):

Year-to-Year Change	Cash	Check	Money Order	Credit	Debit	Prepaid	OBBP	BANP
2010 – 2011	-0.001 ***	-0.014 ***	NA	-0.002 *	0.013 ***	0.002	0.006	-0.001
2011 – 2012	-0.009 ***	-0.010 ***	NA	-0.005 **	-0.019 ***	-0.001	-0.010 ***	-0.007
2012 – 2013	-0.012 ***	-0.009 ***	0.001	0.006 ***	0.010 ***	-0.003	0.001	0.006 **
2013 – 2014	-0.020 **	-0.013 ***	-0.002	0.014 *	0.036 ***	0.001	0.000	0.003
2014 – 2015	0.026 ***	-0.005	-0.001	0.000	-0.028 ***	0.004	-0.003	0.000
2015 – 2016	-0.001 ***	0.001	0.002	-0.005	0.002 ***	0.006 ***	-0.001	0.001
2016 – 2017	0.013 ***	-0.009 ***	0.001	0.004	-0.009 ***	0.004 ***	-0.007 ***	-0.004
2017 - 2018	-0.024 **	-0.003 ***	0.000	-0.014 **	0.018 *	0.002 ***	0.001 ***	0.021 ***

Source: Survey of Consumer Payment Choice, 2010–2018.

Note: Calculated as the difference between each consecutive year dummy coefficients. The 2014 year dummy was omitted from the regressions.

Table 5: Year-to-year changes in bill shares, controlling for demographics and income (based on shares of bills regressions)

year to year change: share of bills regressions	Cash	Check	Money Order	Credit	Debit	Prepaid	OBBP	BANP
2014 as base								
2010 – 2011	0.016	-0.035 ***	NA	0.010 **	0.015 ***	0.002	-0.002	-0.010
2011 – 2012	-0.004 ***	-0.024 ***	NA	-0.004	0.010 **	-0.002	-0.028	-0.008
2012 – 2013	-0.007 ***	-0.011 ***	0.000	0.005	-0.001	-0.003	0.008 ***	0.008
2013 – 2014	-0.014 **	-0.017 **	0.001	0.004	0.013	0.002	0.014	0.005
2014 – 2015	0.017 **	-0.010	-0.005	-0.003	-0.005	0.008 **	-0.015	0.017 *
2015 – 2016	0.001 ***	0.002	0.002	0.003	0.002	0.004 ***	-0.011 ***	0.000 **
2016 – 2017	0.016 ***	-0.021 ***	0.000	0.010	0.001	0.007 ***	-0.011 ***	-0.007
2017 - 2018	-0.015 ***	-0.007 ***	-0.001	-0.023 *	0.006	0.001 ***	-0.004 ***	0.047 ***

Year-to-year changes in purchase shares, controlling for demographics and income (based on shares of purchases regressions):

year to year change: share of purchases regressions	Cash	Check	Money Order	Credit	Debit	Prepaid	OBBP	BANP
2014 as base								
2010 – 2011	0.000 ***	-0.006 ***	NA	-0.005	0.015 ***	0.001	0.000	-0.001 **
2011 – 2012	-0.017 ***	-0.006 ***	NA	-0.007 **	-0.029 ***	0.000	0.001	-0.004 **
2012 – 2013	-0.009 ***	-0.008 ***	0.001	0.009 ***	0.013 ***	-0.002	-0.002 *	0.001
2013 – 2014	-0.022 **	-0.013 ***	-0.001	0.016 *	0.044 ***	0.001	0.001	-0.001
2014 – 2015	0.023 **	-0.004	0.000	0.003	-0.034 ***	0.001	0.000	0.000
2015 – 2016	0.001 ***	0.003	0.001	-0.009	0.002 ***	0.007 ***	-0.001	0.001
2016 – 2017	0.011 ***	-0.004	0.001	0.002	-0.018 ***	0.004 ***	-0.001 **	-0.004
2017 - 2018	-0.024	-0.004 **	0.002 **	-0.010 *	0.027 **	0.001 ***	0.001	0.006 *

Source: Survey of Consumer Payment Choice, 2010–2018.

Note: Calculated as the difference between each consecutive year dummy coefficients. The 2014 year dummy was omitted from the regressions.

Table 6: Changes in check and cash use among panelists, 2016 to 2017 and 2017 to 2018

Check use	2016 to 2017	2017 to 2018
Check use total		
% of all consumers who decreased check use	40.7%	36.4%
Average drop in share	-0.08	-0.07
% of all consumers who increased check use	33.8%	36.4%
Average increase in share	0.07	0.06
% of all consumers check use stayed the same	25.5%	27.2%
Check use for bill pay		
% of all consumers who decreased check use for bill pay	37.0%	33.7%
Average drop in share	-0.15	-0.14
% of all consumers who increased check use	29.7%	31.2%
Average increase in share	0.13	0.12
% of all consumers check use for bill pay stayed the same	33.3%	35.0%
Check use for purchases		
% of all consumers who decreased check use for purchases	33.2%	31.3%
Average drop in share	-0.09	-0.10
% of all consumers who increased check use for purchases	29.5%	30.3%
Average increase in share	0.11	0.08
% of all consumers check use for purchases stayed the same	37.2%	38.4%
Cash use	2016 to 2017	2017 to 2018
Cash use total		
% of all consumers who decreased cash use	45.5%	52.1%
Average drop in share	-0.16	-0.18
% of all consumers who increased cash use	49.0%	43.4%
Average increase in share	0.16	0.15
% of all consumers cash use stayed the same	5.5%	4.5%
Cash use for bill pay		
% of all consumers decreased cash use	22.1%	25.4%
Average drop in share	-0.21	-0.24
% of all consumers who increased cash use	26.0%	24.3%
Average increase in share	0.24	0.20
% of all consumers cash use for bill pay stayed the same	51.9%	50.2%
Cash use for purchases		
% of all consumers who decreased cash use for purchases	46.0%	52.7%
Average drop in share	-0.20	-0.21
% of all consumers who increased cash use for purchases	47.6%	41.8%
Average increase in share	0.19	0.18
% of all consumers cash use for purchases stayed the same	6.4%	5.5%
Total number of participants (current year)	3099	3153
Number of respondents who participated in both years	2681	2573

Source: Survey of Consumer Payment Choice, 2016–2018

Table 7a: Consumers who reduced their check or cash use from 2016 to 2017

2016 to 2017	Decreased cash use	Decreased cash use for bill pay	Decreased cash use for purchases	Decreased check use	Decreased check use for bill pay	Decreased check use for purchases
Number of Consumers	1206	575	1183	1122	1017	912
Under 25	51%	36%	55%	28%	29%	18%
25-34	44%	19%	44%	28%	28%	24%
35-44	45%	23%	45%	37%	35%	32%
45-54	46%	22%	47%	47%	42%	36%
55-64	45%	23%	43%	47%	43%	37%
Over 64	46%	21%	48%	50%	41%	42%
Less than high school	43%	22%	37%	30%	22%	24%
High school	42%	25%	44%	39%	36%	31%
Some college	48%	24%	47%	37%	37%	30%
College	44%	19%	44%	48%	42%	38%
Graduate	53%	17%	53%	45%	38%	42%
Less than \$25,000	45%	34%	46%	31%	30%	28%
\$25,000-\$49,999	47%	25%	46%	39%	33%	30%
\$50,000-\$74,999	42%	18%	45%	45%	42%	34%
\$75,000-\$99,999	44%	21%	44%	45%	42%	34%
More than \$100,000	47%	17%	48%	43%	38%	38%
Male	45%	21%	45%	41%	36%	34%
Female	46%	23%	46%	41%	38%	33%
White	45%	21%	45%	42%	39%	35%
Black	38%	27%	38%	30%	30%	21%
Asian	56%	27%	57%	43%	46%	42%
Other	47%	48%	51%	32%	32%	35%
Employed	45%	20%	46%	41%	38%	33%
Unemployed	41%	31%	39%	22%	25%	18%
Retired	50%	20%	50%	49%	40%	42%
Disabled or other	44%	31%	43%	37%	33%	31%

Source: SCPC, 2016 and 2017. Interpretation: 50 percent of consumers over 64 years old reduced their use of checks from 2016 to 2017.

Table 7b: Consumers who reduced their check or cash use from 2017 to 2018

2017 to 2018	Decreased cash use	Decreased cash use for bill pay	Decreased cash use for purchases	Decreased check use	Decreased check use for bill pay	Decreased check use for purchases
Number of Consumers	1320	626	1288	1024	920	843
Under 25	45%	30%	51%	20%	9%	25%
25-34	54%	25%	54%	32%	29%	25%
35-44	51%	28%	51%	36%	29%	33%
45-54	53%	27%	56%	37%	34%	32%
55-64	49%	25%	49%	40%	39%	33%
Over 64	54%	22%	53%	41%	41%	36%
Less than high school	48%	31%	48%	21%	17%	18%
High school	52%	29%	55%	30%	29%	27%
Some college	53%	28%	50%	31%	30%	28%
College	55%	22%	55%	45%	40%	34%
Graduate	47%	19%	49%	46%	39%	44%
Less than \$25,000	50%	33%	50%	25%	21%	22%
\$25,000-\$49,999	52%	29%	53%	33%	28%	29%
\$50,000-\$74,999	53%	22%	56%	38%	36%	33%
\$75,000-\$99,999	46%	23%	47%	47%	37%	38%
More than \$100,000	57%	22%	55%	40%	42%	35%
Male	51%	26%	52%	35%	34%	30%
Female	53%	25%	53%	37%	34%	33%
White	51%	23%	52%	38%	37%	32%
Black	54%	36%	52%	25%	18%	25%
Asian	50%	39%	46%	41%	30%	37%
Other	57%	27%	57%	39%	34%	32%
Employed	52%	25%	54%	38%	34%	32%
Unemployed	49%	25%	50%	22%	11%	21%
Retired	52%	20%	54%	42%	41%	39%
Disabled or other	54%	31%	47%	31%	30%	25%

Source: SCPC, 2017 and 2018. Interpretation: 41 percent of consumers over 64 years old reduced their use of checks from 2017 to 2018.

Table 8: Average year-to-year change in check share for bills and purchases, 2016–2018 sample

Check Use	% of consumers	Change in Share (Magnitude)					
		16-17 avg change in bill	16-17 avg change in purchase	16-17 avg change in total share	17-18 avg change in bill	17-18 avg change in purchase	17-18 avg change in total share
Bill share 16-17							
increase	28.3%	0.127	0.026	0.045	-0.095	-0.021	-0.035
decrease	33.9%	-0.145	-0.023	-0.056	0.033	-0.006	0.005
flat	30.7%	0.000	0.011	0.005	0.015	-0.001	0.007
Purchase share 16-17							
increase	28.2%	0.006	0.107	0.061	-0.040	-0.078	-0.048
decrease	30.6%	-0.045	-0.090	-0.071	0.005	0.026	0.015
flat	36.0%	-0.004	0.000	0.000	-0.001	0.018	0.012
Total share 16-17							
increase	33.6%	0.066	0.080	0.072	-0.055	-0.052	-0.043
decrease	38.3%	-0.092	-0.063	-0.076	0.013	0.019	0.017
flat	25.0%	-0.002	0.002	0.000	0.017	0.014	0.014

Notes:

- (1) 33.9% of panelists reduced their check use for bills from 2016 to 2017. The average decline in check-use share for bill payments was 0.145. Those consumers then *lowered* their share of check use for purchases the following year, from 2017 to 2018, by 0.006.
- (2) 30.6% of panelists reduced their check use for purchases from 2016 to 2017. The average decline in check-use share for purchases was 0.090. Those consumers then *raised* their share of check use for bill payments the following year, from 2017 to 2018, by 0.005.

Source: Author’s calculations based on the Survey of Consumer Payment Choice, 2016–2018.

Table 9: Average year-to-year change in cash share for bills and purchases, 2016–2018 sample

Cash Use	% of consumers	Change in Share (Magnitude)					
		16-17 avg change in bill	16-17 avg change in purchase	16-17 avg change in total share	17-18 avg change in bill	17-18 avg change in purchase	17-18 avg change in total share
Bill share 16-17							
increase	23.4%	0.237	0.074	0.133	-0.166	-0.069	-0.109
decrease	20.1%	-0.207	-0.060	-0.109	0.068	-0.008	0.018
flat	49.4%	0.000	0.000	0.000	0.020	-0.019	-0.010
Purchase share 16-17							
increase	44.3%	0.057	0.192	0.148	-0.042	-0.121	-0.103
decrease	44.1%	-0.028	-0.186	-0.138	0.012	0.060	0.039
flat	6.4%	0.029	0.000	0.028	-0.017	0.027	0.008
Total share 16-17							
increase	46.6%	0.089	0.167	0.166	-0.057	-0.110	-0.114
decrease	44.6%	-0.060	-0.166	-0.155	0.025	0.044	0.045
flat	5.6%	0.000	0.000	0.000	0.031	0.104	0.096

Notes:

- (1) 20.1% of panelists reduced their cash use for bills from 2016 to 2017. The average decline in cash-use share for bill payments was 0.207. Those consumers then *lowered* their share of cash use for purchases the following year, from 2017 to 2018, by 0.008.
- (2) 44.1% of panelists reduced their cash use for purchases from 2016 to 2017. The average decline in cash-use share for purchases was 0.186. Those consumers then *raised* their share of cash use for bill payments the following year, from 2017 to 2018, by 0.012.

Source: Author’s calculations based on the Survey of Consumer Payment Choice, 2016–2018.

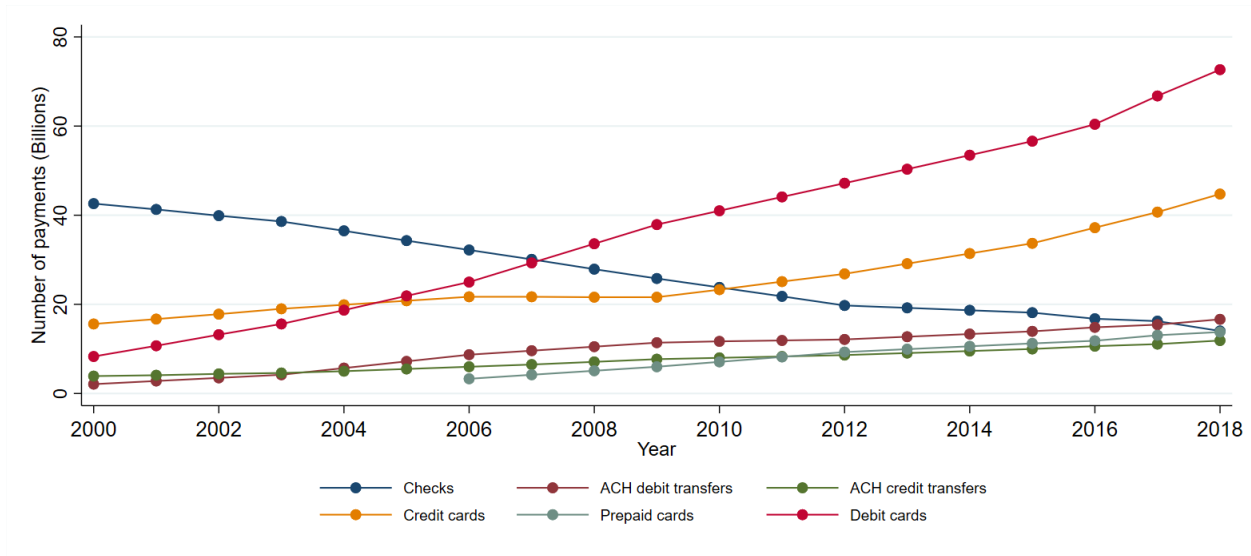
Table 10: State-level correlations, levels and year-to-year change

State-level correlation	2016 electronic bill share vs. 2017 Cash/Check share (level-level correlation)	2016-2017 change in electronic bill share vs. 2016-2017 change in Cash/Check share (change-change correlation)
Cash share, all payments	-0.236	-0.151
Cash share, bills only	-0.153	-0.219
Cash share, purchases	-0.258	-0.070
Check share, all payments	-0.477	-0.112
Check share, bills only	-0.431	-0.401
Check share, purchases	-0.467	0.140

State-level correlation	2017 electronic bill share vs. 2018 Cash/Check share levels (level-level correlation)	2017-2018 change in electronic bill share vs. 2017-2018 change in Cash/Check share (change-change correlation)
Cash share, all payments	-0.367	0.311
Cash share, bills only	-0.315	-0.078
Cash share, purchases	-0.211	0.277
Check share, all payments	-0.099	-0.423
Check share, bills only	-0.439	-0.332
Check share, purchases	0.128	-0.430

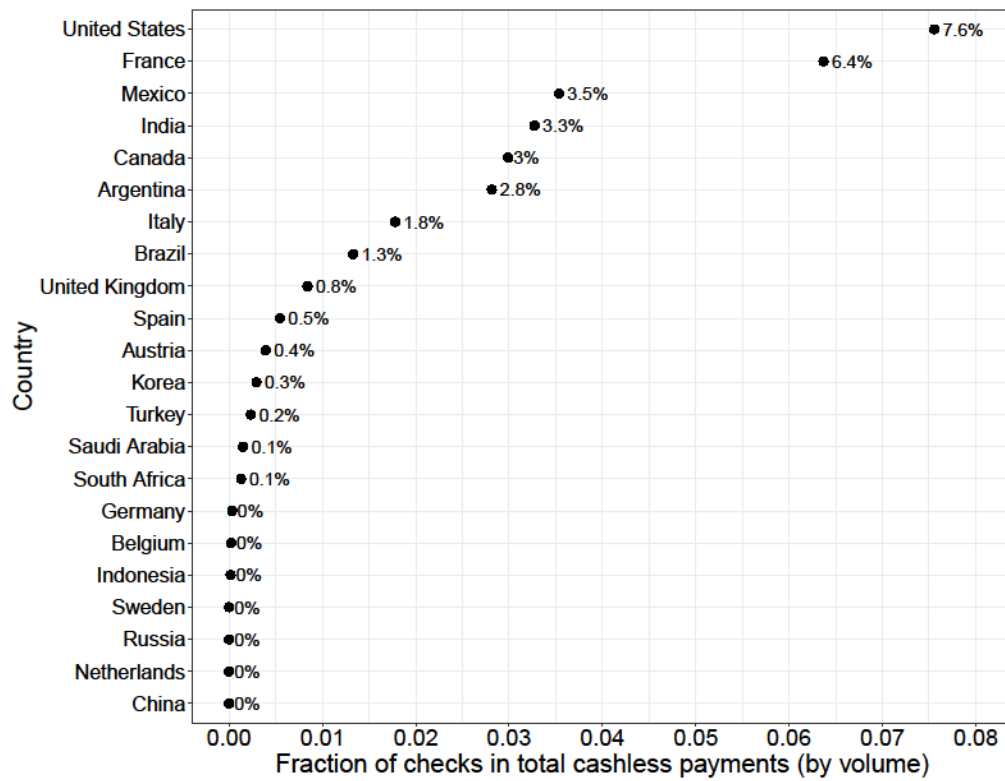
Source: Survey of Consumer Payment Choice, 2016–2018

Figure 1: Total number of noncash payments in the United States



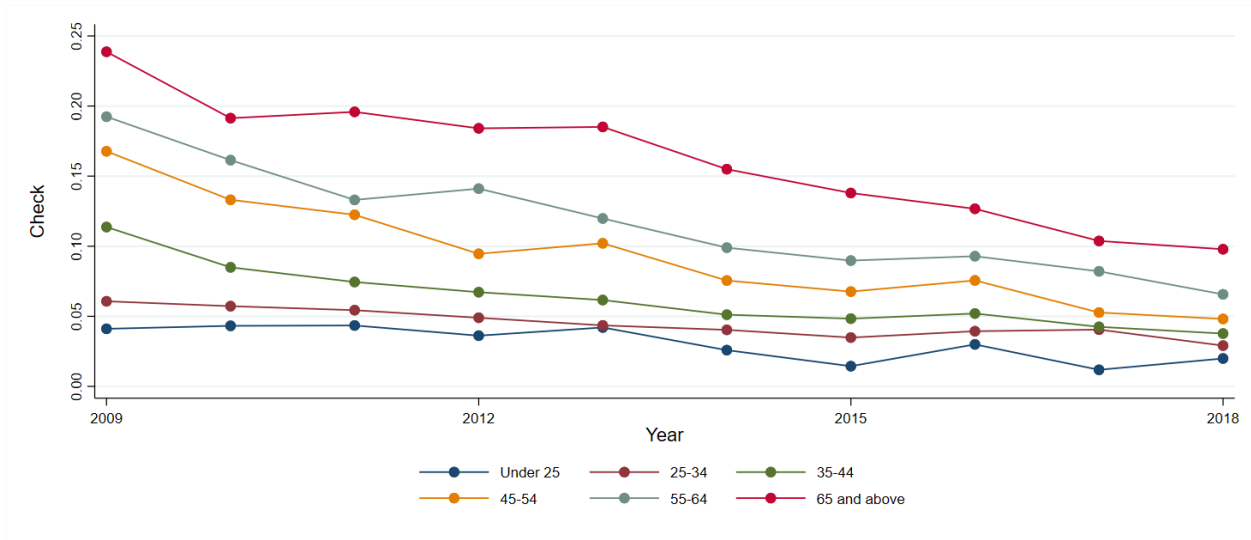
Source: Federal Reserve Payment Study.

Figure 2: Number of checks as a share of all noncash payments in 22 countries in 2019



Source: Oz Shy's calculations based on the Bank of International Settlements Redbook, <https://stats.bis.org/statx/toc/CPMI.html>.

Figure 3: Share of all transactions paid with checks by consumer's age in the United States



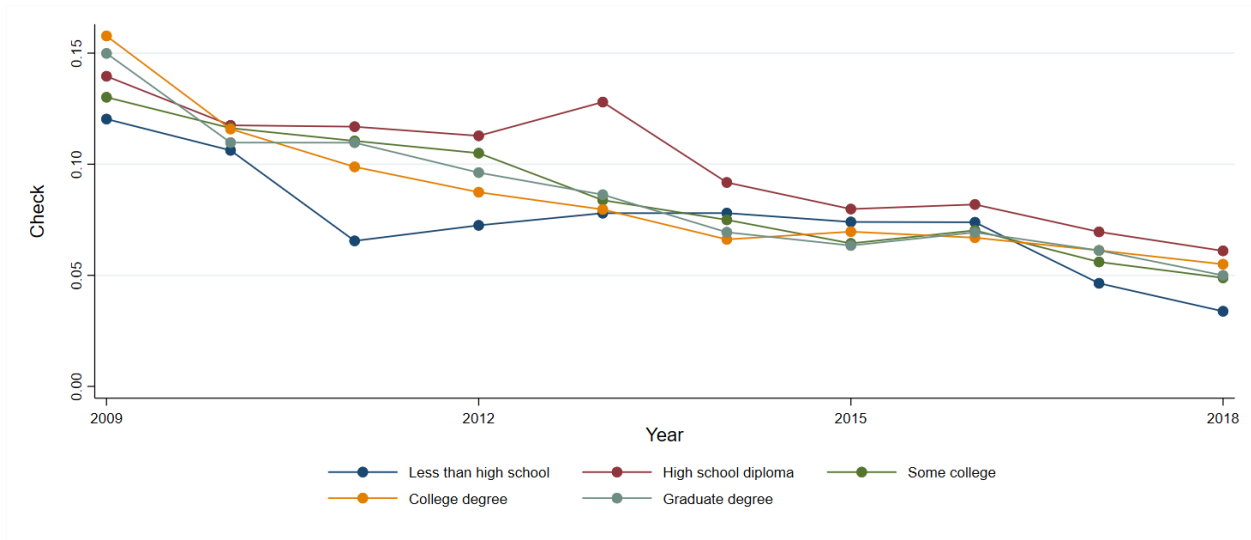
Source: Survey of Consumer Payment Choice, 2009–2018.

Figure 4: Share of all transactions paid with checks by consumer's annual household income



Source: Survey of Consumer Payment Choice, 2009–2018.

Figure 5: Share of all transactions paid with checks by consumer's education level



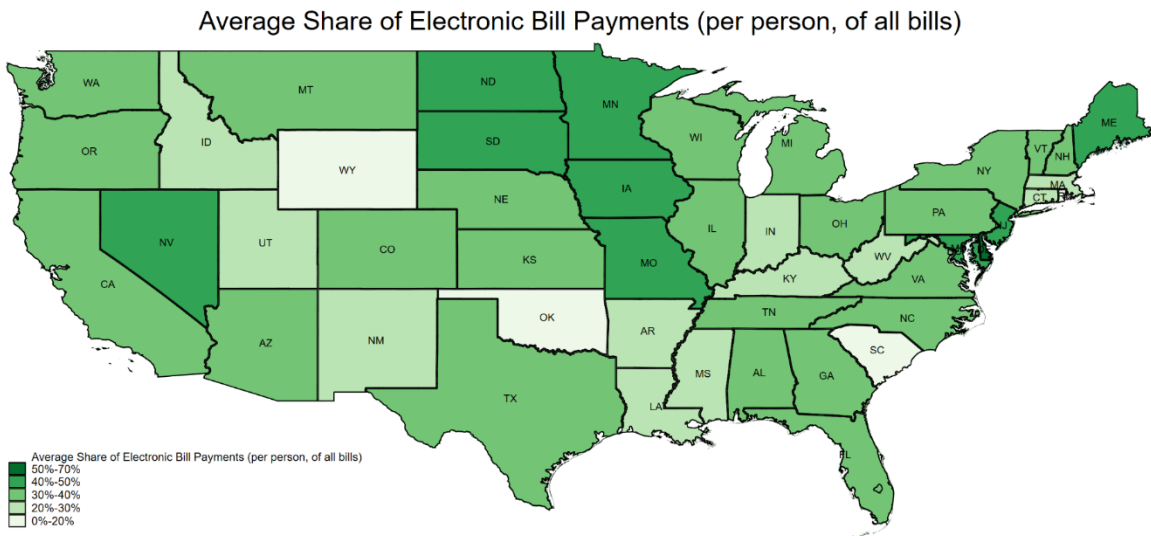
Source: Survey of Consumer Payment Choice, 2009–2018.

Figure 6: Share of bill payments paid with check by consumer's age in the United States



Source: Survey of Consumer Payment Choice, 2009–2018.

Figure 7: Average share of bill payments paid electronically per person by state



Source: 2018 Survey of Consumer Payment Choice.

Note: Share of bills paid electronically in a typical month for each consumer, averaged across all consumers residing in the state