# The Impact of Unemployment Insurance and Unsecured Credit on Business Cycles<sup>†</sup>

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6 Abstract

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How does unsecured consumer credit impact the effectiveness of unemployment insurance (UI) in insuring households against aggregate risk? The answer depends on whether credit acts as a complementary or substitutable form of consumption insurance for households. Using a real business cycle model with frictional labor markets and defaultable debt, I find that unsecured credit amplifies the consumption-equivalent welfare gains of a counter-cyclical policy which extends the duration of UI during all recessions. This occurs because UI extensions mitigate the rise in the default-risk premium during recessions, which allows households to better smooth consumption over the business cycle.

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## 6 1 Introduction

Unemployment insurance (UI) is a well-established automatic stabilizer of the economy. In 1970, the US government enhanced the UI program by instituting automatic triggers to extend the duration of benefits by 13 weeks during recessions. This policy was enacted with the goal of mitigating the welfare costs of business cycles by providing additional consumption insurance to households when income risk is high. Since this time, the unsecured consumer credit market has grown at an unprecedented rate in the US. The total balance of revolving consumer credit now exceeds \$1.2 trillion, and nearly 45% of households report having positive balances of credit card debt. Despite the growing significance for the balance sheets of US households, it is unclear how unsecured credit impacts the effectiveness of UI in insuring households against aggregate risk. The answer depends on whether credit acts as a complementary or substitutable form of consumption insurance for households over the business cycle.

There are two main channels that determine whether unsecured credit complements or substitutes for UI: a substitution effect and a risk premium effect. When households become unemployed, many borrow to replace a fraction of their lost income. An increase in the transfer of resources via UI allows households to borrow less to finance the same level of consumption. I refer to this as the substitution effect. In isolation, this channel could dampen the impact of UI on consumption because households are substituting one form of insurance for the other. The risk premium effect moves in the opposite direction. When the government increases the transfer of resources to households, financial intermediaries reduce the default-risk premium for a given level of debt because the probability of a bankruptcy falls. The risk premium effect could amplify the impact of UI on consumption because the two forms of insurance are complementing each other: enhancements to UI make it cheaper to use unsecured credit.

The main quantitative result of this paper is that unsecured credit amplifies the consumptionequivalent (CE) welfare gains of a policy which extends the duration of UI during recessions.

The result crucially depends on the presence of business cycles. During recessions, credit

<sup>1.</sup> The Federal-State Extended Benefits (EB) Program provides 13 additional weeks of UI benefits when unemployment is persistently high in a state.

contracts which significantly limits the ability of households to substitute between UI and unsecured credit for consumption insurance. This causes the complementary forces to dominate. Extending the duration of UI not only insures against income loss during unemployment, it mitigates the fall in unsecured credit balances by reducing the rise in the default-risk premium. By contrast, I find that the substitutable forces dominate in an economy without business cycles. Extending the duration of UI in a steady state equilibrium without aggregate risk results in smaller welfare gains when unsecured credit is available because households can readily substitute between UI and credit to smooth consumption.

The results of this paper come from an incomplete markets general equilibrium real 52 business cycle model that incorporates frictional labor markets into a model with unsecured credit and consumer bankruptcy. In the style of KMRS12; Krusell et al. (2017), the labor market features standard labor supply forces and frictions. Flows between employment and unemployment are determined by endogenous labor supply decisions by households and by exogenous labor market frictions. The credit market is modeled in the style of Chatterjee et al. (2007) and Livshits, MacGee, and Tertilt (2007), where financial intermediaries offer a menu of loan prices to households dependent on default probabilities. Business cycles are driven by cyclical changes to TFP and labor market frictions. In this setting, changes in bankruptcy behavior over the business cycle result in fluctuations in the menu of loan prices offered by financial intermediaries. UI policies have the potential to mitigate cyclical fluctuations in unsecured credit markets by insuring against bankruptcy risk. The theory that the price of unsecured credit depends on default behavior is supported by empirical work from Gross et al. (2021), which finds that a 1 percent increase in bankruptcy risk results in a 70-90 basis points increase in the interest rate of credit cards.

Unsecured consumer credit is highly volatile and pro-cyclical in the data.<sup>2</sup> In order to quantitatively assess the importance of liquidity constraints and borrowing behavior for consumption smoothing over the business cycle, we need a model that can explain these facts: a task that has not yet been completed by pre-existing literature. Herkenhoff (2019) generates pro-cyclical credit by assuming that credit supply exogenously expands following a recession via the efficiency of matching lenders to households. Nakajima and Ríos-Rull

<sup>2.</sup> Revolving credit balances are about 3 times as volatile as GDP.

(2019) provides a theory to explain why credit is pro-cyclical, but their model with cyclical earnings skewness shocks can only generate about one-quarter of the volatility of unsecured credit. By comparison, my model generates pro-cyclical credit and over 84% of the standard deviation of unsecured credit balances despite being untargeted in the calibration procedure. To better understand why my model with unemployment risk improves in matching the data, I run a decomposition exercise where I remove cyclical changes to TFP, job separation rates, and job finding rates for unemployed workers one at a time. I find that over 92% of the volatility in unsecured credit is driven by the cyclical dynamics of job finding rates. Job finding rates drive aggregate fluctuations because UI is designed to insure households against relatively short unemployment spells. When job finding rates fall during recessions, intermediaries raise the default-risk premium on credit, and households delever (or save) to insure themselves against the possibility of a prolonged unemployment spell. My model improves on the literature's ability to match the cyclical properties of unsecured credit in the data because I specifically model the underlying unemployment dynamics that generate changes in the skewness of earnings over the business cycle.

The main experiment of this paper is to quantify the implications of counter-cyclical UI policies in the benchmark economy with unsecured credit and in a counter-factual economy without credit. I find that a policy which extends the average duration of UI by 13 weeks during recessions has larger CE welfare gains for households in the economy with credit. Specifically, households would trade 0.054% of lifetime consumption on average to obtain the policy in the economy with credit, and they would only trade 0.043% to obtain the same policy in the economy without credit. I also find that UI is more effective at stabilizing aggregate fluctuations when households have unsecured credit. The policy which extends the duration of UI by 13 weeks during recessions reduces the average peak-to-trough fall in aggregate consumption during recessions by 0.42pp in the economy with credit. The same policy only reduces the average peak-to-trough fall in aggregate consumption by 0.24pp in the economy without credit. This result adds to the literature which studies the usefulness of credit as consumption insurance. Athreya, Tam, and Young (2009) finds that unsecured

<sup>3.</sup> CE welfare is the share of lifetime consumption a household born during an expansion in the economy with an acyclical UI policy would trade to be in the economy where the government extends the duration of UI during recessions.

credit does not smooth consumption over the life cycle, and Nakajima and Ríos-Rull (2019) finds that it does not smooth aggregate consumption over the business cycle. Although unsecured credit does not smooth cyclical consumption fluctuations by itself, I show that it does amplify the extent to which UI stabilizes aggregate consumption: the largest component of aggregate demand.

I then measure how much of the main quantitative results depend on the presence of business cycles. Specifically, I measure the effects of extending the duration of UI in a steady state equilibrium without aggregate risk. In this environment, the main result of the paper changes, and UI extensions lead to smaller welfare gains and a smaller increase in aggregate consumption in the model with unsecured credit. These results add to the work of Braxton, Herkenhoff, and Phillips (2023), which measures the optimal replacement rate (RR) of UI in an economy without aggregate risk. They find that the government can optimally reduce the RR of UI when unsecured credit is available because households can substitute between UI and credit to smooth consumption. I show that business cycles play a meaningful role for the relationship between UI and unsecured credit because cyclical fluctuations in consumer credit markets limit the extent to which households can substitute between UI and credit.

I conclude the analysis of this paper by comparing the aggregate implications of the UI policy which extends the duration of benefits during recessions to a counterfactual policy which increases the level of benefits. It is essential to understand how these policies impact aggregate fluctuations because both have been implemented in recent recessions. If find that a policy which increases the replacement rate (RR) of benefits during recessions has a smaller impact on aggregate fluctuations. Even though the policy costs the same for the government, increasing the RR of benefits only reduces the average peak-to-trough fall in aggregate consumption during recessions by 0.13pp: compared to 0.42pp for UI extensions. In terms of welfare, households on average prefer the policy which extends the duration of benefits, and unsecured credit amplifies the difference between the policies. In the model with credit, the welfare gains from UI extensions are 0.013 percentage points higher than increasing the RR, and they are only 0.005 percentage points higher in the model with no

<sup>4.</sup> The Emergency Unemployment Compensation Act extended the duration of UI up to 99 weeks during the Global Financial Crisis. The Federal Pandemic Unemployment Compensation Program provided up to \$600 of additional benefits per week to UI recipients during Covid-19.

credit. Unsecured credit amplifies the differences between the two policies because of both supply side and demand side factors. On the supply side, extending the duration of UI during recessions leads to a significantly smaller contraction in the average borrowing limit offered by financial intermediaries. On the demand side, UI extensions limit the incentive of households to delever (or save) for precautionary reasons.

## 134 1.a Related Literature

Since Zeldes (1989) showed empirical evidence that liquidity constraints have a significant 135 impact on consumption for a sizeable portion of the population, the quantitative importance 136 of borrowing constraints for consumption smoothing behavior has become well-established 137 in the macroeconomics literature. Papers such as Kaplan and Violante (2010, 2014) show that the consumption response to income shocks and fiscal policy is significantly affected 139 by the tightness of borrowing constraints. Imrohoroglu (1989) found that borrowing can 140 reduce the welfare costs of business cycles by as much as a factor of six depending on the 141 borrowing limit in the economy. My work contributes to this literature by developing a 142 model which can explain the business cycle properties of unsecured credit. Previously, the 143 model with cyclical earnings skewness shocks in Nakajima and Ríos-Rull (2019) was able to 144 explain about one-quarter of the volatility in unsecured credit over the business cycle. They 145 calibrate their model to match moments from Guvenen, Ozkan, and Song (2014), which 146 uses annual tax return data to find that earnings risk becomes significantly more left-skewed during recessions. The difficulty with calibrating a model to match moments from annual 148 tax return data is that it is impossible to tell if the change in earnings risk is coming from 149 changes in wages or unemployment. A change in wages, job separation rates, or job finding 150 rates could all create earnings risk that is more left-skewed during recessions, but I show 151 that the latter is what drives the high volatility of unsecured credit balances. Therefore, it 152 is necessary to account for the underlying unemployment dynamics that generates changes 153 in the skewness of earnings risk to explain the business cycle properties of unsecured credit. 154 This paper also contributes to the literature which studies the relationship between 155 forms of public and private insurance. The most similar paper in the literature is Braxton, 156 Herkenhoff, and Phillips (2023). Both papers study how unsecured credit affects the welfare

gains of UI policies, but I quantify the effects of aggregate risk and business cycle fluctuations. The most related empirical work is by Hsu, Matsa, and Melzer (2014, 2018) which shows evidence that more generous UI policies result in lower interest rates and higher borrowing limits on credit cards.<sup>5</sup> Their paper also finds that extensions in UI significantly reduced mortgage defaults during the Global Financial Crisis (GFC). Other papers include Athreya and Simpson (2006) which shows that increasing the generosity of UI can actually lead to more bankruptcies in the aggregate because households increase debt balances.<sup>6</sup> Bornstein and Indarte (2023) finds evidence that higher levels of Medicaid lead to more credit card borrowing. My work contributes to the literature by showing that business cycle fluctuations significantly impact the relationship between UI and unsecured credit. Focusing on business cycle dynamics provides an important contribution to the literature because most changes to UI are temporary and occur during recessions. 

Quantifying the relationship between unsecured credit and UI also contributes to the literature which studies the impact of UI policies on spending. There are two main takeaways from this literature: First, temporary changes to UI benefits can provide significant stimulus for aggregate spending, and second, households exhibit minimal forward looking behavior when responding to UI policies in micro data. Gerard and Naritomi (2021) and Ganong et al. (2023) both provide evidence from micro data that unemployed workers increase spending when receiving a transitory increase in transfers during unemployment despite having a permanent decrease in income. The former uses data on severance payments from Brazil, and the latter uses data on UI supplements in the US during the Covid-19 pandemic. My work adds to this literature by studying how unsecured credit impacts the aggregate response to counter-cyclical UI policies. Kekre (2023) finds that UI extensions during the Great Recession led to a significant increase in aggregate demand for consumption. His results are driven by heterogeneous MPCs and a reduced precautionary savings motive associated with UI extensions. My paper adds to his results by showing that unsecured credit amplifies the impact of counter-cyclical UI extensions on aggregate consumption fluctuations. Further-

<sup>5.</sup> The results pertaining to the interest rate and borrowing limit on credit cards are in the 2014 working paper version of the paper.

<sup>6.</sup> Preliminary work by Makoto Nakajima also studies the relationship between UI, unsecured credit, and consumer bankruptcies using a model economy.

more, Ganong and Noel (2019) shows that unemployed workers fail to smooth consumption leading up to the exhaustion of benefits and that extending the duration of UI provides al-186 most 4 times as much consumption insurance as an equivalent increase in the level of benefits. 187 Similar to their analysis, I find that UI extensions provide greater consumption insurance 188 than increases in the the level of benefits. I also show that unsecured credit amplifies the 189 differences between the two policies because UI extensions are more effective at mitigating 190 contractions in unsecured consumer credit during recessions. 191

The rest of the paper is organized as follows. Section 2 describes the model economy. 192 Section 3 maps the model to the data. Section 4 runs a decomposition exercise to better 193 understand the sources of aggregate fluctuations. Section 5 provides results to the main research question. Section 6 provides concluding remarks.

#### 2 Model 196

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This section defines a general equilibrium real business cycle model with four types of eco-197 nomic agents. A representative firm rents capital and labor to produce a single output good. 198 Overlapping generations of households choose whether or not to supply labor to the firm in 199 a frictional labor market. They also borrow and save by purchasing securities from financial 200 intermediaries. Idiosyncratic risk and incomplete asset markets give rise to an endogenous distribution of households in the spirit of Huggett (1993) and Aiyagari (1994). Financial 202 intermediaries sell securities to households at a discount price that reflects the probability 203 of a bankruptcy occurring. Intermediaries also own capital and rent it to the firm in a com-204 petitive market. The government uses income taxes to fund transfers to households. The 205 model is defined recursively in discrete time.

#### 2.a The Firm's Problem

A representative firm produces output from aggregate capital and aggregate labor. Let 208  $\Omega = \{x, \mu\}$  be the aggregate state space of the model economy, where  $\mu$  is the endogenous distribution of households over individual state variables, and x is the exogenous state of the economy. The exogenous state fluctuates between expansions  $x_g$  and recessions  $x_b$ , 211

and  $\pi_x(x, x')$  is the probability matrix governing the transitions. I assume that aggregate productivity z(x) is a function of exogenous state such that TFP falls during recessions.

$$\max_{K,L} z(x)F(K,L) - \delta K - r(\Omega)K - w(\Omega)L \tag{1}$$

The firm rents capital and labor to solve the problem described by equation (1). Let K be the aggregate demand for capital. The equilibrium return to capital that solves the firm's problem is  $r(\Omega)$ . The labor market is modeled in the spirit of a Lucas-Prescott island economy. Only workers on the production island supply labor to the firm. As in LP74<empty citation>, the labor market is competitive such that the firm demands labor to the point where the wage rate  $w(\Omega)$  equals the marginal value of labor for workers on the production island. Let L be the aggregate demand for labor.

### $_{21}$ 2.b Households

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There are J overlapping generations of households in the model economy. Every period, a cohort of size  $\phi_J$  dies and is replaced by a new cohort of the same size. I assume there is a measure one continuum of households such that  $\sum_{j=1}^{J} \phi_j = 1$ . Age 1 households are born into the economy with good credit, zero assets, and a fraction  $\Phi_E$  are employed. They retire at age  $J_r$  and die at age J. They derive utility  $u(c_j, n_j)$  by consuming the single output good minus utility costs of work. Households discount future utility at rate  $\beta$ . Let  $\Psi_j = (\epsilon_j, a_j, n_j, s_j)$  be a point in the individual state space of the household problem.

Households differ with respect to their labor productivity. Productivity has two components: an age component and a persistent component. The age component of productivity  $\gamma_j$  exhibits a hump-shaped life cycle profile which gives young households an incentive to borrow against future earnings. I assume that the persistent component of productivity  $\epsilon_j$  evolves according to the stochastic AR(1) process detailed below. Let  $\eta$  be the innovations to the persistent process where  $\sigma_{\eta}^2$  is the variance of innovations. The persistence of individual productivity is  $\rho$ .

$$\log(\epsilon_{j+1}) = \rho \log(\epsilon_j) + \eta, \quad where \quad \eta \in N(0, \sigma_{\eta}^2)$$

The labor market builds off the work of KMRS12; Krusell et al. (2017) where house-

holds have the option to supply labor to the firm in a frictional market.<sup>7</sup> The environment simultaneously accounts for labor market frictions and standard labor supply forces that are 239 present in the stochastic growth model. A household's employment state n can have one of 240 three realizations: employed E, nonemployed N, or nonemployed with no UI  $\tilde{N}$ . I assume 241 that all households who begin the period in state E are on the production island. There-242 fore, the aggregate supply of labor by households is the sum of individual productivity of all workers with state E. Those who have state N or  $\tilde{N}$  are on the leisure islands. An em-244 ployed household chooses whether or not to guit a job, and a nonemployed household chooses 245 whether or not to search for work. Equation (2) describes the extensive-margin labor supply 246 decision where  $h \in \{e, u\}$  is the corresponding decision rule. I assume that households pay a utility cost of  $\chi_s$  to search for work when in nonemployment. Therefore, households must 248 weigh the expected future earnings of work against the costs of participating in the labor 240 market. 250

$$V(\Psi_{j}, \Omega) = \max \left[ V^{e}(\Psi_{j}, \Omega) - \chi(n_{j}), V^{u}(\Psi_{j}, \Omega) \right]$$

$$h(\Psi_{j}, \Omega) = \begin{cases} e & if \quad V^{e}(\Psi_{j}, \Omega) - \chi(n_{j}) \ge V^{u}(\Psi_{j}, \Omega) \\ u & otherwise \end{cases}$$

$$\chi(n_{j}) = \begin{cases} \chi_{s} & if \quad n_{j} \in \{N, \tilde{N}\} \\ 0 & otherwise \end{cases}$$

$$(2)$$

Flows between employment states are affected by the endogenous decisions of households and the exogenous labor market frictions. Figure 1 describes the transitions between labor market states. Workers who quit a job transition to  $\tilde{N}$ , and workers who are exogenously separated transition to N. Let  $\xi(x)$  be the involuntary separation rate: the fraction of households who transition to unemployment despite choosing to work. Households on the

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<sup>7.</sup> **KMRS12**<**empty citation**> is the NBER working paper version of Krusell et al. (2017). The working paper was set in general equilibrium, and the final published version was in partial equilibrium. The model in the current paper is most similar to the NBER working paper.

<sup>8.</sup> I also assume that all retired households are on a leisure island.

<sup>9.</sup> Let e be the decision to keep a job while employed or search for a job when not employed. Similarly, u is the decision to quit a job or refrain from search.

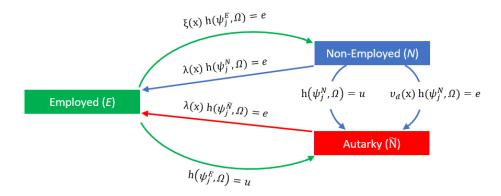


Figure 1: Labor Market Transitions

Note. — h is the decision to quit a job while working or the decision to search for a job when in not working.  $\xi(x)$  is the exogenous job separation rate, and  $\lambda(x)$  is the job finding rate; both frictions depend on the exogenous aggregate state of the economy.  $v_d$  is the inverse expected duration of UI. Assume that all households with n = E are on the production island.

leisure islands can choose whether or not to search for work. Let  $\lambda(x)$  be the job finding 258 rate: the probability of transitioning to n' = E when searching for work. The labor market 259 frictions vary with the exogenous state of the economy such that the labor market becomes 260 more frictional during recessions. I assume that all employment transitions take place after 261 production, meaning aggregate labor is known at the start of a model period. 10 262

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The UI regime is modeled to depict the key features of the US system. A worker who is 263 involuntarily separated transitions to N and is eligible for UI. However, workers who quit a job are not eligible for benefits and transition to  $\tilde{N}$ . The level of benefits is determined by the replacement rate  $v_r$  which is the fraction of lost labor earnings. Let  $\overline{v}$  be the maximum level of benefits that an individual can receive. Households must be searching for work to receive UI. While receiving benefits,  $v_d(x)$  is the probability of losing access to UI and 268 transitioning to  $\tilde{N}$ . This allows the model to replicate the average duration of benefits during an unemployment spell without adding a variable to the state space. The duration of UI 270 depends on the aggregate exogenous state so the benchmark economy can be calibrated to replicate the Federal-State Extended Benefits Program (EB) which provides 13 additional 272 weeks of benefits during recessions.

Equation (3) describes the default decision where  $d \in \{p, b\}$  is the subsequent decision

<sup>10.</sup> In the online appendix, I show that assuming quits take place before production has a quantitatively insignificant effect on the results.

rule. The Let  $a_j \in A$  be the current asset level where I make the standard assumption that  $a_j < 0$  is debt and  $a_j > 0$  is savings. In the spirit of Chatterjee et al. (2007) and Livshits, MacGee, and Tertilt (2007), the default decision is modeled to depict a chapter 7 bankruptcy filing in the US. I make the following assumptions about bankruptcy: all assets are immediately discharged, the household pays a utility cost  $\chi_b$ , and there is no saving allowed in the period of a bankruptcy. Furthermore, access to credit is determined by credit status  $s_j$ . Bankruptcy causes a household to move to bad credit  $s_b$  where there is no borrowing. Let  $V^{h,b}$  be the value of declaring bankruptcy and moving to bad credit.

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$$V^{h}(\Psi_{j}, \Omega) = \max \left[ V^{h,p}(\Psi_{j}, \Omega), V^{h,b}(\Psi_{j}, \Omega) - \chi_{b} \right]$$

$$d(\Psi_{j}, \Omega) = \begin{cases} p & if \quad V^{h,p}(\Psi_{j}, \Omega) \ge V^{h,b}(\Psi_{j}, \Omega) - \chi_{b} \\ b & otherwise \end{cases}$$

$$(3)$$

Let  $q(a_{j+1}; \Psi_j, \Omega)$  be the menu of discount prices over all of the possible choices of secu-284 rities. The price for a specific security  $a_{j+1}$  reflects the probability of a bankruptcy occurring 285 next period. In this setting, the discount price decreases with the amount borrowed, and a 286 household's borrowing limit is an endogenous outcome of the loan price schedule. The in-287 tuition for the endogenous borrowing limit is similar to a Laffer Curve: if a household tried 288 to borrow an infinite amount of debt, intermediaries would offer a discount price of zero and households couldn't borrow any resources. Similarly, households do not borrow if they 290 choose  $a_{j+1} = 0$ . Therefore, along the menu of loan prices there is a maximum amount of 291 debt that can be borrowed. The equilibrium menu of loan prices provides an essential feed-292 back mechanism for my analysis. UI affects bankruptcy behavior which feeds back through 293 the menu of prices for credit to impact the consumption decisions of households. 294

Households choose consumption and net savings as described by equation (4). Let  $W(\Psi_j, \Omega)$  be a function that determines the pre-tax labor earnings of a household with characteristics  $\Psi_j$ . Labor earnings are individual productivity times the equilibrium wage rate when employed. Similarly,  $T^U(\Psi_j, \Omega)$  is the transfer of UI benefits dependent on the eligibility of the household. I assume that benefits are calculated using the persistent productivity

<sup>11.</sup> I define p as the decision to repay debts and b as the decision to declare bankruptcy.

 $\epsilon_j$  from the most recent period of employment. This reflects the fact that UI benefits are based on an individual's labor earnings from before the unemployment spell began. House-holds also receive transfers during retirement  $T^R$ , and they receive a lump-sum transfer of  $T^R$  from the government during working years. Households who begin the period in bad credit still solve Bellman equations (2)-(4) except that the borrowing limit is set to 0, and they transition to good credit next period with probability  $\theta$ . This assumption allows the model to replicate the average duration that a bankruptcy stays on the credit score of an individual without increasing the size of the state space.

$$V^{h,p}(\Psi_{j},\Omega) = \max_{c_{j}, a_{j+1}} u(c_{j}, n_{j}) + \beta \sum_{x'} \pi_{x}(x, x') E\left[V(\Psi_{j+1}, \Omega')|\Psi_{j}\right]$$
s.t. 
$$c_{j} + q(a_{j+1}; \Psi_{j}, \Omega) a_{j+1} = a_{j} + (1 - \tau)W(\Psi_{j}, \Omega) + T^{U}(\Psi_{j}, \Omega) + T_{j}$$
and 
$$\mu' = \Gamma(\Omega), \quad c_{j} > 0, \quad a_{j+1} \ge 0 \quad \text{if} \quad s_{j} = s_{b}$$

$$W(\Psi_{j}, \Omega) = \begin{cases} w(\Omega)\gamma_{j}\epsilon_{j} & \text{if} \quad n_{j} = E \\ 0 & \text{otherwise} \end{cases}$$

$$T^{U}(\Psi_{j}, \Omega) = \begin{cases} \min\{v_{r}w(\Omega)\gamma_{j}\epsilon_{j}, \overline{v}\} & \text{if} \quad n_{j} = N \quad \text{and} \quad h(\Psi_{j}, \Omega) = e \\ 0 & \text{otherwise} \end{cases}$$

$$T_{j} = \begin{cases} T^{R} & \text{if} \quad j \ge J^{R} \\ T & \text{otherwise} \end{cases}$$

Retired households are permanently out of the labor force. I choose to model retirement to create a realistic life cycle savings motive for working households. Retirement is not of primary interest to the paper because retired households are not affected by unemployment risk or UI policies. I assume that retired households do not have access to unsecured credit. This assumption should not have a significant effect on the results of the paper because unsecured credit and default are concentrated in young households in the model and in the data.

<sup>12.</sup> This is accomplished by assuming  $\epsilon_{j+1} = \epsilon_j$  when a household is not employed.

All of the decision problems outlined in equations (2) through (4) assume households have rational expectations. Uninsurable idiosyncratic risk coupled with incomplete asset markets creates an endogenous distribution of households over state variables. In the spirit of Krusell and Smith (1998), the distribution of households follows the law of motion  $\mu' = \Gamma(\Omega)$ . Agents in the model economy know the law of motion which allows them to form rational expectations over future prices.

#### 2.c Financial Intermediaries

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A continuum of risk-neutral financial intermediaries serve two main purposes in the model 327 economy: they sell securities to households, and they rent capital to the firm. I assume that 328 the market for intermediation is competitive such that zero profits are earned in expectation 329 on each security. Equation (5) describes the menu of equilibrium prices offered to an age j330 household for all possible choices of  $a_{j+1}$ . I assume that the intermediary knows the produc-331 tivity and employment status of a household, and the intermediary has rational expectations 332 with respect to the future return on capital. The prices offered to an age j household depend 333 on the probability of a bankruptcy next period at age j+1. All else equal, an increase in the probability of a bankruptcy reduces the expected return of the loan, and the discount price 335 falls to ensure zero profits in expectation. I assume that  $\iota$  is a proportional cost paid by the 336 intermediary to monitor debt contracts. For savings, the discount price is always equal to 337 the inverse of the expected return on capital because there is no default on positive assets. 338

$$q(a_{j+1}; \Psi_j, \Omega) = \sum_{x'} \pi_x(x, x') E\left[\frac{1 - d(\Psi_{j+1}, \Omega') - \iota(a_{j+1})}{1 + r(\Omega')}\right]$$
where  $\mu' = \Gamma(\Omega)$ , and  $\iota(a_{j+1}) = \iota$  if  $a_{j+1} < 0$ 

Financial intermediaries own all of the capital in the model economy. They rent net household savings in the form of capital to the firm. Because intermediaries have both loans and capital on the balance sheet, these assets must have the same expected return in equilibrium. This has important general equilibrium implications for credit. All else equal, a fall in the return to capital increases the discount price of credit making it cheaper to borrow.

$$\Pi(\Omega) = (1 + r(\Omega)) K - K' + \sum_{j=1}^{J} \int_{\Psi} q(a_{j+1}; \Psi_j, \Omega) a_{j+1} \mu(d\Psi_j)$$

$$- \sum_{j=1}^{J} \int_{\Psi} (1 - d(\Psi_j, \Omega) - \iota(a_j)) a_j \mu(d\Psi_j)$$
(6)

Intermediaries earn zero profits in expectation on each security, but aggregate uncer-346 tainty makes it such that they can have realized profits or losses. Equation (6) details the 347 profits of intermediaries  $\Pi(\Omega)$  in a model period. Intermediaries receive the returns to cap-348 ital net of depreciation, and they invest capital with the firm for next period's production. 349 They also sell new securities  $a_{j+1}$  at the discount price q. Intermediaries pay out the net 350 balance of securities that were sold last period. No revenue is received from debt that is in a 351 bankruptcy claim. They also pay monitoring costs for pre-existing debt contracts. The total 352 return on past securities and the total liabilities from newly issued securities are aggregated 353 over the distribution of households. 13 I assume that net profits are taxed fully each period 354 by the government. Realized net profits in the calibrated model economy are quite small 355 such that distributing them in a different way should have a small effect on the results of the paper. 357

## 358 2.d The Government

The government collects income taxes from all households where  $\tau$  is the tax rate. The government also facilitates transfers to households through three different programs: UI benefits, social security benefits, and lump-sum transfers. Equation (7) describes the government budget constraint where  $G(\Omega)$  is net government expenditures. The government consumes the remaining goods after collecting taxes and distributing transfers. I assume that government consumption fluctuates in response to changes in the aggregates state of

<sup>13.</sup> I integrate over the entire individual state space for households. I represent this with an integral over  $\Psi_j$ . A more detailed description of the aggregation process would be to sum over discrete states  $\epsilon$ , n, and s and integrate over the continuous state a. I suppress the full notation to improve the readability of the model equations.

the economy. 14

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$$G(\Omega) = \sum_{j=1}^{J_R} \int_{\Psi} \tau W(\Psi_j, \Omega) \mu(d\Psi_j) - \sum_{j=1}^{J_R} \int_{\Psi} T^U(\Psi_j, \Omega) \mu(d\Psi_j)$$
$$- \sum_{j=1}^{J} \int_{\Psi} T_j \mu(d\Psi_j) + \Pi(\Omega)$$
 (7)

# 2.e Equilibrium Definition

An equilibrium in the model economy occurs when economic agents behave optimally and all markets clear. Before defining the equilibrium concept, I define aggregate variables needed to solve for an equilibrium in the model economy. Aggregate labor supply is the total productivity of households who are currently employed at the market wage. Similarly, aggregate consumption is the total consumption summed over the distribution of households. Aggregate investment I is derived from the intermediaries problem as invested capital less non-depreciated capital.

$$C = \sum_{j=1}^{J} \int_{\Psi} c(\Psi_j, \Omega) \,\mu(d\Psi_j) \tag{8}$$

$$K' = \sum_{j=1}^{J} \int_{\Psi} q(a_{j+1}; \Psi_j, \Omega) a_{j+1} \mu(d\Psi_j)$$
 (9)

$$I = K' - (1 - \delta)K \tag{10}$$

$$\iota A^{-} = \sum_{j=1}^{J} \int_{\Psi\{a<0\}} \iota \, a_{j} \, \mu(d\Psi_{j}) \tag{11}$$

Definition 1 A recursive equilibrium is the household value function V, decision rules  $(a_{j+1}, c_j, h_j, d_j)$ , prices (r, w), the menu of discount prices q, and the distribution of households  $\mu$  such that

1. Factor prices (r, w) solve the firm problem described by equation (1).

<sup>14.</sup> G is never negative in the calibrated model economy, so the government budget constraint is never violated in equilibrium.

- The decision rules  $(a_{j+1}, c_j, h_j, d_j)$  solve the household problems described by equations (2)-(4) where V is the resulting value function.
- 380 3. Financial intermediaries offer a menu of prices q to earn zero profits in expectation described by equation (5).
- 4. Net government expenditures are described by the government budget constraint in equation (7).
- 5. The distribution of households is consistent with individual decisions and the transition probabilities for individual state variables.
  - 6. The market for securities clears at the menu of loan prices. The market for capital clears at the factor price  $r(\Omega)$  that solves the firm's problem. The market for labor clears by equation (12), where the demand for labor from the firm's problem equals to the total supply of labor of workers on the production island. The market for goods clear in equation (13) below where  $\iota A^-$  are the resources spent to monitor debt contracts.

$$L = \sum_{j=1}^{J_r} \int_{\Psi\{n_j = E\}} \gamma_j \epsilon_j \,\mu(d\Psi_j) \tag{12}$$

$$C + I + G(\Omega) + \iota A^{-} = zF(K, L)$$
(13)

# 3 Model to Data

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The model is mapped to the data to depict the US economy from 1980Q1 to 2019Q4.
The specified period covers five recessions in which the Federal Government extended the
duration of UI benefits. The US economy also experienced significant cyclical fluctuations
in unsecured credit and consumer bankruptcies making it an excellent basis to study how
credit affects the implications of UI policies. Mapping the model to the data proceeds in
three stages. First, a group of parameters are chosen outside the model solution. A separate

group of parameters are then calibrated so the model replicates a set of key moments from the data. Finally, I compare simulated results to a set of untargeted moments from the data to test the validity of the model.

#### 3.a Parameters Set Outside the Model Solution

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The values of the aggregate exogenous transition matrix  $\pi_x$  are set using the average duration of expansions and recessions in the US. To this end, let the length of a model period be 1 quarter. The persistence of expansions is set such that the average expansion lasts just under 7 years, and the persistence of recessions is set such that the average recession lasts 406 quarters. The transition values reported below make the model consistent with business 407 cycle data on peak and trough quarters reported by the NBER from 1980Q1 to 2019Q4.

$$\pi_x = \begin{vmatrix} 0.964 & 0.036 \\ 0.217 & 0.783 \end{vmatrix}$$

The parameters governing the UI regime in the model economy are chosen to be con-410 sistent with the Regular Benefits and the Federal-State Extended Benefits (EB) Program 411 in the US. There are four parameters that determine the level and duration of benefits: 412  $\{v_r, \overline{v}, v_d(x_g), v_d(x_b)\}$ . I set  $v_d(x_g)$  so the average duration of UI benefits is 2 quarters during 413 expansions. Similarly, I set  $v_d(x_b)$  so the average duration of benefits is 3 quarters during re-414 cessions. This policy is consistent with the EB Program which provides 13 additional weeks 415 of benefits when unemployment is high. The replacement rate of UI is set to 50% of pre-tax 416 earnings. Therefore, the replacement rate of after-tax earnings is 71%. The maximum level 417 of benefits is 42% of average earnings in the economy. The parameters governing the UI 418 regime are consistent with the summary statistics on benefits reported in Hsu, Matsa, and Melzer (2018). 15 420

The parameters governing the life cycle of the household are set such that the model exhibits an empirically consistent hump-shaped earnings profile. Households are born into the economy at age 25, they retire at age 65, and they die at age 75. Due to the quarterly

<sup>15.</sup> They look at data on UI in the United States from 1991-2010. They report the median duration of benefits across states to be 26 weeks. They also report that the ratio of max weekly benefits to average weekly wages is 0.42, and they discuss that most states replace about 50% of lost earnings.

frequency of the model, the total number of periods in the life cycle of a household is 200. The retirement age  $J_r$  is set to 160. The age-component of productivity is parameterized 425 such that  $\gamma_j = \nu_1 j + \nu_2 j^2$ . Using data on earnings from the SCF, I estimate  $\nu_1$  and  $\nu_2$  to be 426  $4.58e^{-2}$  and  $-9.36e^{-4}$  respectively. Because age is only reported in one-year intervals in 427 the SCF, I assume that  $\gamma_j$  changes deterministically every 4 model periods. The estimated 428 age-component of productivity generates a hump-shaped earnings profile over the life cycle 429 which has been shown by Livshits, MacGee, and Tertilt (2007) and Athreya, Tam, and Young 430 (2009) to be a significant component of the demand for borrowing by young households who 431 have higher default rates. 432

The remaining parameters chosen outside the model solution are set to be consistent with 433 commonly used values from the literature. 17 The process governing the persistent-component 434 of productivity is consistent with Krusell et al. (2017): the persistence of the productivity 435 process is 0.989 and the standard deviation is 0.103. Households value consumption with 436 constant relative risk aversion (CRRA) preferences  $u(c,n) = \frac{c^{1-\sigma}}{1-\sigma} - \chi_w \mathbb{1}_{\{n=E\}}$ . The coefficient 437 of relative risk aversion  $\sigma$  is set to 2.0. Let  $\chi_w$  be the utility cost of work. Aggregate production follows a Cobb-Douglass function  $F(K,L) = zK^{\alpha}L^{1-\alpha}$  where the capital share 439 of production is 35%. The tax rate  $\tau$  is set to 30%, and the pre-tax transfer to retired 440 households is 50% of average earnings in the model economy. The probability of leaving bad 441 credit  $\theta$  is 2.5% so the average duration of bad credit lasts 10 years, which is the amount of time a bankruptcy remains on an individual's credit score in the US.

### 3.b Model Calibration

The remaining parameters are calibrated so the model reproduces a set of key moments from the data over the time period of interest. To this end, I simulate the benchmark economy and update parameters until the model generated moments match the data. Table 1 details all of the moments targeted in the calibration procedure.

To simultaneously match aggregate capital holdings and revolving credit balances, I assume heterogeneity in household discount factors. Specifically, there are two types of

<sup>16.</sup> I estimate the age-component of earnings in every survey from 1989 through 2019 and take the average.

<sup>17.</sup> A table with the full set of model parameters is included in appendix A.

Table 1: Calibration Targets

	Data	Model
	First M	oments
Capital / GDP	224.07	224.04
Investment / Capital	7.89	7.88
Government $\exp / \text{GDP}$	5.38	5.27
Credit balance / GDP	4.83	4.86
Debt share	41.37	41.69
Credit spread	11.73	11.69
Bankruptcy rate	0.88	0.86
Participation rate	73.73	73.63
Unemploy. rate	6.32	6.33
Unemploy. duration (weeks)	20.93	20.92
	Second N	Moments
$\sigma(GDP)$	1.23	1.23
$\sigma(\text{Unemp. Rate})$	11.12	11.02
$\sigma(\mathrm{Job\ Find})/\ \sigma(\mathrm{Job\ Sep})$	1.62	1.58

Note.— Data from 1980Q1-2019Q4 except for debt share which begins in 1983 and credit spreads which begin in 1994Q4. First moments are annualized and in percentages except for unemployment duration which is in weeks. Government exp is national defense spending in the data. Debt share is the fraction of households in the labor force with credit card debt. Second moments are log and HP filtered with a smoothing parameter of 1600.  $\sigma(\text{Job Find})$  is standard deviation of job finding rates, and  $\sigma(\text{Job Sep})$  is standard deviation of job separation rates.

households: patient who discount the future at rate  $\beta_h$ , and impatient who discount at rate  $\beta_\ell$ . The discount factors are calibrated to match the ratios of capital and revolving credit balances to GDP. The share of impatient households  $\pi_\ell$  is then set to match the fraction of households in the labor force with positive balances of credit card debt. The assumption of preference heterogeneity is supported by empirical work from Fulford and Schuh (2017) who estimate a life cycle model of consumption, unsecured credit, and default with patient and impatient individuals. The calibrated share of impatient households in my benchmark economy is within their range of estimates.

The model is also calibrated to match various moments for output and unemployment.

I normalize the expansion value of TFP to 1, and I set the recession value in order to match
the standard deviation of real GDP in the data. The expansion value of involuntary job
separation rates  $\xi$  is chosen to match the average unemployment rate in the data. Similarly, the expansion value of job finding rates  $\lambda$  is chosen to match the average duration of

unemployment. The recession values for job separation rates and finding rates are chosen to match second moments for unemployment. Specifically, the model matches the standard deviation of unemployment rates in the data. The model also matches the ratio of the standard deviation of job finding rates to the standard deviation of job separation rates. This is done to ensure that the share of fluctuations in unemployment coming from each labor market friction is consistent with the data. To calculate these moments in the data, I use the methodology described in Shimer (2012). This methodology calculates job separation rates and finding rates using readily available aggregate time series data.

Furthermore, the model is calibrated to match various aggregate and financial variables 472 in the data. The disutility of bankruptcy  $\chi_b$  and the cost of monitoring  $\iota$  are set to match 473 the bankruptcy rate and the credit spread respectively. <sup>18</sup> Capital depreciation  $\delta$  is set to 474 match the average aggregate investment to capital ratio. The lump-sum transfer to working 475 households T is chosen to match the ratio of government expenditures to real GDP. I choose 476 to target national defense spending as the measure of government expenditures in the data for 477 two main reasons. First, it is intuitively the closest measure to government consumption in the model, which is expenditures that do not flow back to households. Second, it ensures that 479 government consumption is always positive in equilibrium. With regards to labor markets, 480 I make the simplifying assumption that the utility cost of work is equal to the utility cost of 481 search, and  $\chi_w$  is calibrated to match the labor force participation rate. I also assume that 482 the share of new households who are employed is equal to the average share of employed households in the model economy. 484

#### 485 3.c Model Validation

This section tests the validity of the model by comparing model-generated results to empirical moments that were not targeted in the calibration procedure. There are two stages to the model validation: (1) macro-level moments; (2) micro-level moments. For the macro-level validation, the model is compared to standard moments used for business cycle analysis: second moments of aggregate and financial time series. Table 2 details the standard deviation

<sup>18.</sup> The unsecured credit spread in the data is the spread of the average interest rate on credit card accounts that are assessed interest over the interest rate on 1-year treasury bills.

and cross-correlation with real GDP for key times series in the benchmark model economy and in the data. The empirical moments are generated using quarterly data that is seasonally adjusted, in logs, and HP filtered with a smoothing parameter of 1600. 19 All data is available from 1980Q1 except for unsecured credit spreads which are available from 1994Q4. For the micro-level validation, I simulate a large number of households who experience a job separation, and I compare the results to papers in the literature that estimate the effects of unemployment using micro data. The results from the model are described in figure 2. The online appendix includes additional model validation results including the distribution of unsecured credit over income and comparisons to papers that estimate the impact of UI on re-employment wages.

The most important result from this section of the paper is the model generates the cyclical properties of unsecured revolving credit balances in the data. This is a significant contribution to the consumer credit and default literature because the leading models have had trouble explaining why unsecured credit is so volatile over the business cycle. The model with cyclical earnings skewness shocks in Nakajima and Ríos-Rull (2019) can explain about one-quarter of the total standard deviation of unsecured credit. Fieldhouse, Livshits, and MacGee (2016) finds that their model needs intermediation shocks to generate credit that is procyclical, and their model also under-predicts the volatility of unsecured credit balances. My benchmark model economy generates over 84% of the volatility in unsecured credit balances by using empirically consistent unemployment dynamics over the business cycle. The model also generates consumer bankruptcies and unsecured credit spreads which are highly volatile and counter-cyclical. Reproducing the cyclical properties of unsecured credit and consumer bankruptcies is not just an important contribution to the literature, it is also a necessary step towards quantifying how unsecured credit affects the usefulness of UI in insuring households against aggregate risk.

The model also has success generating the cyclical properties of other aggregate time series in the data. Aggregate consumption is pro-cyclical and less volatile than GDP. Ag-

<sup>19.</sup> Revolving credit balances, unemployment rates, and participation rates are quarterly averages of monthly data. Bankruptcy data is non-business filings.

<sup>20.</sup> Non-business bankruptcies are still highly volatile and counter-cyclical in the data if you use a shorter time period that ignores the effects of the 2005 Bankruptcy Abuse and Consumer Protection Act.

Table 2: Untargeted Business Cycle Properties

		C	I	D	В	$\overline{Q}$	U	$\overline{P}$
$\sigma(X)/\sigma(GDP)$	Data	0.77	4.89	2.97	13.62	5.17	9.05	0.20
	Model	0.50	2.49	2.51	13.38	1.76	8.96	0.02
Corr(X,GDP)	Data	0.86	0.90	0.32	-0.35	-0.71	-0.86	0.42
	Model	0.88	0.68	0.58	-0.59	-0.85	-0.83	0.91

Note.— Data is from 1980Q1-2019Q4 except for credit spreads which begin in 1994Q4. Data is in logs, seasonally adjusted and HP filtered with a smoothing parameter of 1600. C is aggregate consumption; I is investment; D is unsecured credit balances; B is consumer bankruptcies; Q is unsecured credit spreads; U is unemployment; P is labor force participation.  $\sigma(X)/\sigma(GDP)$  is relative standard deviation of variable X to GDP. Corr(X,GDP) is correlation coefficient of variable X with GDP.

gregate investment is pro-cyclical and more volatile than GDP. One reason why the model 518 under-predicts the volatility of investment is there are offsetting forces for households. Dur-519 ing a recession, households want to save more for precautionary reasons, which puts upward 520 pressure on investment. However, the return to capital falls, which puts downward pressure 521 on investment. Under-predicting the volatility of investment should not be of first-order importance to the results of the paper because investment dynamics are largely driven by 523 high-wealth households who do not rely on unsecured credit for consumption smoothing. 524 With regards to labor markets, the standard deviation of unemployment was targeted in the 525 calibration procedure, but the model also generates a counter-cyclical correlation very close 526 to the data. Labor force participation is pro-cyclical and much less volatile than GDP. The model under-predicts the volatility of labor force participation, but this should not be of 528 first-order importance to the results of the paper because UI isn't available to individuals 529 who are out of the labor force. 530

Figure 2 describes the average change in consumption, income, debt balances, and bankruptcy rates for households who experience a job separation in the model economy. Formally, I simulate 80,000 households and collect data on those who experience a job separation over an 11-quarter period. The first period of unemployment is t = 0. For consumption and income, I calculate the average percent change from the t = -1 value. Debt balances are the average debt held by the cohort, and bankruptcy rates are the share of the cohort declaring bankruptcy.<sup>21</sup>

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<sup>21.</sup> I use the average debt balance instead of the percent change in debt balances because there are many individuals in the cohort who have zero debt in period t = -1.

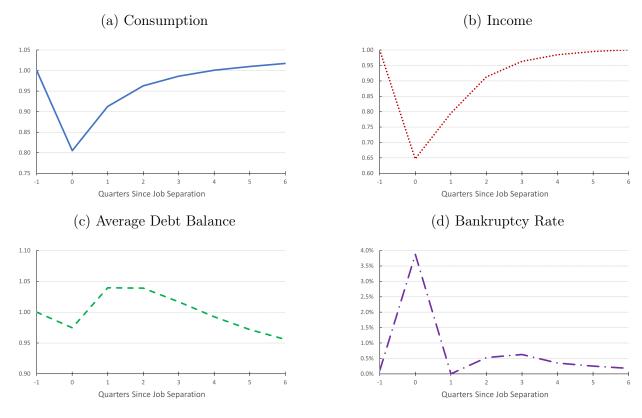


Figure 2: Change following a Job Separation

Note.— Average change following a job separation in the model economy. Period t=0 is the first period of unemployment. Consumption and Income are measured as the average percent change from the t=-1 value. Average debt balance is normalized to the t=-1 value.

The model predicts a fall in consumption during unemployment that is within the range of estimates in the empirical literature. There is an average fall in consumption of 19.6% in the first quarter of unemployment. The average change in consumption for the cohort rebounds quickly because most unemployment spells are only one or two quarters, but consumption continues to fall for households who experience a longer unemployment spell. Overall, the average fall in consumption for unemployed households compared to their most recent period of employment is 24.2%. There is a large literature that estimates the consumption fall during unemployment using micro data. Using data from the Consumer Expenditure Survey (CE), CK16<empty citation> finds that expenditures on nondurables and services fall by 21% during unemployment. They also find that expenditures on food, clothing, recreation, and vacations fall by 24.5% in the CE and 23.5% in the PSID. Ganong and Noel (2019) find smaller estimates using data on Chase checking accounts. Relative to pre-employment

levels, they find that consumption falls by approximately 9% after 3 months of receiving UI payments. AH05<empty citation> uses scanner data to show that consumption falls by 551 19% during unemployment. Earlier work by BBB<empty citation> find in a survey of 552 UI recipients that expenditures on food, clothing, entertainment, and travel fell by 25.7% 553 after 5 weeks of unemployment. 554

Income falls by an average of 35.3% in the first quarter of unemployment in the model 555 economy. The most comparable empirical results in the literature come from Ganong and 556 Noel (2019), who report that income falls by about 23% after 3 months of receiving UI. 557 My model over-predicts the average fall in income from their empirical estimates, but the 558 difference in results largely comes from high-income households. High-income households in my model experience a very large drop in income because their UI benefits are capped by 560 the maximum threshold  $\overline{v}$ . This skews the average drop in income downwards. For compar-561 ison, the median drop in income after 1-quarter of unemployment is 24.9\%, which is quite 562 close to the Ganong and Noel (2019) estimates. There is also a large literature estimating 563 earnings losses following a mass layoff event. JJJ93<empty citation> estimates an average earnings loss of 40% in the year of a separation. LLL20<empty citation> finds 565 an average earnings loss of 43% during the Great Recession. Finally, my parameter for the 566 UI replacement rate of lost earnings is within the range of estimates from the literature. 567 Braxton, Herkenhoff, and Phillips (2023) estimates a replacement rate of 41.2% in the PSID, 568 and RV17<empty citation> estimates a replacement rate of 43.6% in the SIPP. Mitman 569 and Rabinovich (2015) uses a replacement rate of 40% which they take as the average rate 570 in the U.S. Finally, Hsu, Matsa, and Melzer (2018) estimates the impact of max UI benefits 571 across states, and they discuss that most states use a replacement rate of about 50%. I use 572 the top end of this group of replacement rates so as to be as close to the Ganong and Noel 573 (2019) estimates as possible.

With regards to unsecured credit, the average balance of unsecured credit for the cohort 575 that experiences a job separation falls by 2.5% in the first quarter of unemployment in the 576 model economy. It then increases for the second and third quarter of unemployment, and it decreases monotonically after that. There is a non-monotonic response of credit balances in the periods following a job separation because there are heterogeneous effects in the model.

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Relatively constrained households default and delever, and unconstrained households borrow more to smooth consumption after a job separation. Specifically, 23% of households decrease 581 debt balances in the quarter after a job separation and 26% increase. These heterogeneous 582 effects are qualitatively consistent with what Braxton, Herkenhoff, and Phillips (2023) find 583 in the TransUnion data. In their sample, 37% decrease debt balances and 30% increase.<sup>22</sup> 584 With regards to the path of debt, they find that a job separation causes a 1.4% decrease 585 in debt balances in the year following the unemployment spell in the TransUnion data. In 586 my model economy, average debt balances are 0.8% lower four quarters after the separation, 587 and they are 2.8% lower after five quarters. These results are comfortably within the 95% 588 confidence intervals of their estimates.

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The empirical literature has consistently found that unemployment is a main cause of consumer default. For example, Sullivan, Warren, and Westbrook (2000) finds that almost 67% of bankruptcies are due to a job-related income disruption. More recent data comes from Braxton, Herkenhoff, and Phillips (2023), which estimates the impact of a job separation on multiple types of consumer defaults. They find that workers who experience a job separation are 0.52 percentage points more likely to have a new derogatory flag in the year following a job separation, and they calibrate their model to match this moment. This estimate depicts a 0.66 percentage points increase relative to the year before a job separation, with a max increase of 1.13 percentage points within a 95% confidence interval. My model predicts that consumer bankruptcy rates increase by 1.07 percentage points in the year following a job separation relative to the year before. My model is within the 95% confidence interval for their estimate of this moment. However, my model predicts an immediate spike in bankruptcies in the first quarter of unemployment that does not appear in the data.<sup>23</sup> This occurs because bankruptcies are front-loaded in the model. Relatively constrained households who experience an unemployment spell want to default immediately. In the data, unemployed workers most likely spend a period of time in delinquency trying to regain their credit stand-

<sup>22.</sup> Braxton, Herkenhoff, and Phillips (2023) have annual data, so they are calculating the share of individuals who increase or decrease credit card balances between the year before an unemployment spell to the year after an unemployment. Because I have a quarterly model, I am calculating the share of households who increase or decrease borrowing in the first quarter of unemployment.

<sup>23.</sup> In Braxton, Herkenhoff, and Phillips (2023), the largest increase in consumer defaults within a 95% confidence interval in the year of a job separation is a 1.81 percentage points increase in the probability of a charge-off relative to the year before a job separation.

ing before a bankruptcy occurs. In the online appendix, I run a robustness exercise where
I set the replacement rate of UI to  $v_r = 0.79$ , which eliminates the spike in bankruptcies
in the first period of unemployment. The main quantitative results all go through in this
robustness exercise. The spike in bankruptcies in the first period of unemployment has a
relatively small effect on the quantitative predictions of the model because the model still
generates a change in consumption and credit balances that are within the range of estimates
from the data.

With regards to the impact of UI on employment incentives, the model is consistent with 613 papers in the literature that estimate a small positive relationship between UI extensions 614 and the unemployment rate. For example, the model predicts that at the end of a 5-period 615 recession the unemployment rate is 8.96% when the government extends the average duration 616 of UI by 13 weeks, and it is 8.95% without the UI extension. The most relevant papers to 617 my analysis estimate the impact of UI extensions that occur during recessions. Chodorow-618 Reich, Coglianese, and Karabarbounis (2019) find that the UI extensions during the Great 619 Recession had a small impact on unemployment. Specifically, they use a measurement error approach and estimate that a one-month extension in UI benefits led to between a 0.02 621 percentage point increase and a 0.03 percentage point decrease in the unemployment rate. 622 Their data does not reject the zero response on the unemployment rate at any horizon. 623 Work from Rot11<empty citation> and FV15<empty citation> both estimate that 624 UI extensions led to a small increase in unemployment rates during the Great Recession.<sup>25</sup> They find that the majority of the impact is due to a decrease in labor force exits and not from 626 a decrease in job finding rates. Their estimates are consistent with the operative mechanism 627 in my model: UI extensions incentivize fewer workers to leave the labor force which puts a 628 small upward pressure on unemployment rates. HKMM13<empty citation> finds much 629 larger effects. They estimate that unemployment rates would have been about 2 percentage points lower in 2011 without UI extensions. Because the empirical estimates vary widely, I 631 choose a model framework in the middle-ground where UI extensions have a limited effects 632 on employment incentives so as to not drive the main quantitative results of the paper. 633

<sup>24.</sup> The model still predicts that unsecured credit amplifies the welfare effects of counter-cyclical UI extensions, and the model still depicts unsecured credit balances that are highly volatile and pro-cyclical.

<sup>25.</sup> FV15<empty citation> finds similar estimates during the 2001 recession in the U.S.

Table 3: Decomposition of Aggregate Fluctuations

		C	I	D	В	Q	U
Std Dev $(X)$	(1) Benchmark	0.62	3.06	3.09	16.46	2.17	11.02
	(2) Fixed $z$	0.47	2.46	3.86	14.93	1.46	10.97
	(3) Fixed $\xi$	0.50	2.46	2.03	13.67	1.47	6.69
	(4) Fixed $\lambda$	0.26	2.52	0.23	5.12	1.28	4.72
	(5) Fixed $\lambda$ ; recalibrate	0.38	3.03	0.82	12.40	1.78	11.26
Corr(X,GDP)	(1) Benchmark	0.88	0.68	0.58	-0.59	-0.85	-0.83
	(2) Fixed $z$	0.23	0.48	0.85	-0.13	-0.44	-1.00
	(3) Fixed $\xi$	0.94	0.70	0.49	-0.57	-0.86	-0.74
	(4) Fixed $\lambda$	0.98	0.94	-0.63	-0.73	-0.87	-0.72
	(5) Fixed $\lambda$ ; recalibrate	0.96	0.92	0.47	-0.57	-0.67	-0.85

Note.— C is aggregate consumption; I is investment; D is unsecured credit balances; B is average bankruptcy rate; Q is average spread of credit over capital returns; U is unemployment rate. Fixed z has no cyclical fluctuations in TFP. Similarly, Fixed  $\xi$  holds involuntary job separation rates constant, Fixed  $\lambda$  holds job finding rates constant, and simulation (5) recalibrates the model with fixed  $\lambda$  to match the standard deviation in unemployment.

# <sup>634</sup> 4 The Sources of Aggregate Fluctuations

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I now conduct a decomposition exercise to quantify the sources of aggregate fluctuations over the business cycle. To this end, I simulate the model economy removing cyclical changes to TFP, involuntary job separation rates, and job finding rates for unemployed workers one at a time.<sup>26</sup> This methodology allows me to isolate the impact of each dynamic variable in driving aggregate fluctuations. The decomposition exercise accomplishes two things: it explains why the model improves on the literature's ability to match the cyclical properties of unsecured consumer credit, and it highlights the importance of studying business cycles in an environment with incomplete asset markets and idiosyncratic risk.

The main result from the decomposition exercise is job finding rates for unemployed workers are the main driver of aggregate fluctuations over the business cycle. As seen in simulation (4) of table 3, the majority of the volatility in consumption, unsecured credit, and consumer bankruptcies is explained by job finding rates: the standard deviation of all three variables falls by more than half when job finding rates are held constant. Additionally, unsecured credit balances would be counter-cyclical which is inconsistent with the data.

<sup>26.</sup> Even when involuntary job separation rates are held constant, households are still allowed to endogenously separate from a job by quitting.

Comparing the results to simulation (3), it is easy to see that involuntary job separation rates have a smaller impact on aggregate fluctuations. Part of this result is simply explained 650 by the fraction of unemployment that is caused by each labor market friction. Consistent 651 with results from Shimer (2012), the majority of the volatility in unemployment is driven 652 by job finding rates. However, this does not fully explain why job finding rates have a 653 stronger impact on aggregate fluctuations. The main mechanism driving these results is the 654 precautionary motives of households. When job finding rates fall, households have a strong 655 incentive to reduce consumption and delever (or save) to insure themselves against the pos-656 sibility of a prolonged unemployment spell. Credit plays an important role in understanding 657 this mechanism because in an economy with defaultable debt, indebted households want to delever to avoid bankruptcy if they experience a prolonged unemployment spell. When job 659 separation rates increase during a recession, there is a much smaller impact on consumption 660 and credit decisions because UI protects households against relatively short unemployment 661 spells. 662

The results from the decomposition exercise highlight why the model is able to generate 663 the cyclical properties of aggregate consumption, unsecured credit, and consumer bankrupt-664 cies. The most important contribution to the consumer credit literature is that the model 665 explains over 84% of the standard deviation of unsecured revolving credit balances in the 666 data. The model with cyclical earnings skewness shocks in Nakajima and Ríos-Rull (2019) 667 generates about one-quarter of the same volatility. Their earnings process is calibrated to 668 match annual moments from Guvenen, Ozkan, and Song (2014), which shows earnings risk 669 becomes more left-skewed during recessions. Cyclical changes to earnings skewness in the 670 data could be caused by changes to wages, job separation rates, or job finding rates, but I 671 show that the latter is what drives aggregate fluctuations. Calibrating an earnings process 672 to annual tax return data can miss some of the key details that result in large aggregate fluctuations because you cannot determine the underlying cause of a fall in earnings during 674 a recession. An earnings shock caused by a fall in job finding rates has a larger impact on 675 consumption and unsecured credit because it causes a stronger increase in precautionary 676 behavior and default risk. 677

The insight that job finding rates have a larger impact on aggregate fluctuations high-

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lights the importance of studying business cycles in an environment with incomplete asset markets and idiosyncratic risk. If asset markets were complete, separation rates and finding 680 rates would have the same impact on macroeconomic aggregates if they caused the same 681 change in unemployment because they would result in the same change in income for a rep-682 resentative household. To quantify how important it is to distinguish between fluctuations 683 in job finding rates and separation rates, I recalibrate the model with fixed job finding rates 684 to generate the same volatility in unemployment. Specifically, I assume that job separation 685 rates increase to 6.4% during recessions while job finding rates remain constant at 65%. The 686 results are depicted in simulation (5) of table 2. Even though the recalibrated model gen-687 erates the same volatility in unemployment, there are significantly different fluctuations in aggregate consumption and unsecured credit balances. Consumption is over 38% less volatile 689 when job finding rates are held constant. Moreover, the model only generates 22% of the 690 total volatility in unsecured consumer credit from the data. There are two clear conclusions 691 coming from the results of the model with fixed job finding rates. First, the model's success 692 in generating the high volatility of unsecured credit seen in the data is attributed to having empirically consistent fluctuations in job finding rates over the business cycle. Second, 694 cyclical fluctuations in unemployment can have a vastly different impact on the aggregate 695 economy depending on whether the change is driven by an increase in job separation rates or 696 a decrease in job finding rates, a result that would not occur in a complete markets setting.<sup>27</sup> 697

# 5 Quantitative Results

This section quantifies how unsecured credit impacts the effectiveness of counter-cyclical UI policies. I first measure the effects of a policy which extends the duration of UI during recessions in the benchmark economy with unsecured credit and in a counterfactual economy with no credit. To compare the effectiveness of the policy across the two economies, I use two statistics: a consumption-equivalent (CE) welfare analysis and peak-to-trough changes in

<sup>27.</sup> Job finding rates and job separation rates also have a different impact on aggregate investment via precautionary savings motives. When job finding rates are fixed, households save less for precautionary reasons, which means there are less resources available for consumption throughout a recession. In the online appendix, I show that this channel is quantitatively small, and it mitigates the differences between the benchmark model and the model with fixed job finding rates.

aggregate consumption during recessions. Using both statistics allows me to simultaneously 704 quantify how credit impacts the welfare gains of the UI policy and the extent to which UI 705 smooths aggregate fluctuations over the business cycle. I conclude this section by comparing 706 the policy which extends the duration of UI to a budget-neutral policy which increases the 707 level of benefits during recessions. 708

#### The Amplifying Effects of Unsecured Credit 5.a 709

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I begin by measuring the welfare gains of the policy which extends the duration of UI by 710 13 weeks during recessions. The welfare calculation used is CE: it is the share of lifetime 711 consumption a household would trade to be indifferent between two policies. In this case, the 712 household is indifferent between the policy which extends the duration of UI and a policy 713 where the terms of UI don't change over the business cycle. I refer to the former as the 714 extending UI policy and the latter as the acyclical UI policy. Welfare is calculated for age 715 1 households in order to quantify the full lifetime consumption that makes the household 716 indifferent between the policies.<sup>28</sup>

Equation (14) describes the CE welfare calculation used in this paper. The equation is 718 generalizable to separable household preferences with a CRRA utility function for consump-719 tion. Let  $\omega$  be the share of lifetime consumption that equates value function V from the 720 extending UI policy to value function  $\tilde{V}$  from the acyclical UI policy. In order to calculate CE welfare with separable preferences, it is important to differentiate between the household value function and the value of future consumption streams  $V_c$ . For the model used 723 in this paper, households have separable preferences with respect to consumption, utility 724 costs of work, utility costs of search, and the utility costs of filing for bankruptcy. I provide 725 additional details about how to derive equation (14) in appendix D. There are two main benefits of calculating welfare in this way. First, the solution is analytical, meaning there is no additional computational burden to solve for  $\omega$ . Second, the measurement is CE, making it easy to compare welfare gains across different policy counterfactuals and different models

<sup>28.</sup> It is easy to calculate the welfare of older households, but the interpretation differs slightly. Then, you are calculating the share of remaining lifetime consumption that makes the household indifferent between the two policies.

730 in the literature.

$$\omega(\Psi_j; \Omega) = \left[ \frac{V(\Psi_j; \Omega) - \tilde{V}(\Psi_j; \Omega) + \tilde{V}_c(\Psi_j; \Omega)}{\tilde{V}_c(\Psi_j; \Omega)} \right]^{\frac{1}{1-\sigma}} - 1$$
(14)

Figure 3 details the CE welfare gains of the policy which extends the duration of UI during recessions in the benchmark economy with unsecured credit and in the counterfactual economy with no credit. The main result is that unsecured credit amplifies the CE welfare gains of the *Extending UI* policy. The average household born into the economy with credit would trade 0.054% of lifetime consumption to obtain the extending UI policy. Whereas, the average household would only trade 0.043% to obtain the same policy in the model with no credit. The impact of credit is even larger for impatient households. These households would trade 0.080% of lifetime consumption for the extending UI policy in the economy with credit, but only 0.057% in the economy without credit.

Unsecured credit amplifies the welfare gains of the policy because credit and UI work as complimentary forms of insurance. When the government extends the duration of UI, households reduce their default rates. Lower default rates allow financial intermediaries to lower the default risk premium on unsecured credit which allows households to more readily use credit to smooth consumption. This explains why the welfare gains are largely being driven by impatient households. Impatient households are more likely to use unsecured credit during their lifetime, so they benefit more when the terms of credit improve. The mechanism where UI impacts the default risk premium of unsecured credit is supported by empirical evidence from the literature. Hsu, Matsa, and Melzer (2014, 2018) showed evidence that people in states with more generous UI policies receive credit card offers with higher borrowing limits and lower interest rates. Gross et al. (2021) also provided evidence of this mechanism by showing that a 1 percent reduction in bankruptcy probability translates to a 70-90 basis point decrease in the interest rate on credit cards in the US.

I now measure how unsecured credit impacts the extent to which UI stabilizes aggregate consumption fluctuations. UI has long been considered an automatic stabilizer of the economy, so it is important to understand how the emergence of unsecured credit has impacted the stabilizing effects of UI. To quantify aggregate fluctuations, I measure the peak-to-trough

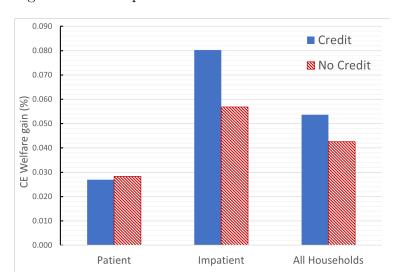


Figure 3: The Impact of Credit on Welfare Gains of UI

Note.— Average consumption-equivalent (CE) welfare gains across age 1 households: percent of lifetime consumption traded to obtain the policy which extends the duration of UI during recessions. Patient are high discount factor households; impatient are low discount factor. Credit is benchmark economy with unsecured credit. No credit is counterfactual economy with no credit.

change in aggregate consumption averaged across all recessions in a 2000 period simulation.

Table 4 details how the peak-to-trough change in consumption is affected by the policy
which extends the duration of UI by 13 weeks during recessions. In the benchmark economy
with unsecured credit, the UI policy reduces the average peak-to-trough fall in consumption
by 0.42pp. In the economy with no credit, the policy only reduces the average peak-totrough fall in consumption by 0.24pp. In appendix ??, I show that the same result holds if
you use the total deviation in aggregate consumption during a recession as opposed to the
peak-to-trough change.

Unsecured credit amplifies the extent to which the Extending UI policy stabilizes aggregate consumption because credit acts as a complementary form of consumption insurance. Evidence of this complementary relationship is seen by looking at the peak-to-trough change in aggregate credit balances. Credit is pro-cyclical in the model and in the data. When the government extends the duration of UI during recessions, it reduces the average peak-to-trough fall in credit balances during recessions by 2.01pp. Households use the additional credit to smooth consumption expenditures during recessions. This equilibrium credit channel is the result of both supply and demand factors. Extending the duration of UI during

Table 4: Peak-to-Trough Declines: Extending Duration of UI

	Benchmark		No C	<u>'redit</u>
	C	D	C	D
Acyclical UI (%)	2.62	10.11	1.89	0.00
Extending UI (%)	2.20	8.10	1.65	0.00
Difference (pp)	0.42	2.01	0.24	0.00

Note.— Peak-to-trough fall in aggregate consumption (C) and credit balances (D) averaged over all recessions in a 2000 period simulation. Peak is the period before a recession starts. Simulation results are in logs and HP filtered with a smoothing parameter of 1600. Benchmark is the economy with unsecured credit and No Credit is the economy with no borrowing.

recessions mitigates the rise in consumer bankruptcies which allows financial intermediaries to supply credit with a lower default risk premium. On the demand side, the UI extension reduces the incentive for households to delever for precautionary reasons. The culminating effect is a significant increase in the extent to which UI stabilizes aggregate consumption fluctuations.

The results from this section make a significant contribution to the real business cycle literature and to the unsecured credit literature. Athreya, Tam, and Young (2009) shows that unsecured credit does not smooth consumption for households over the life cycle. Nakajima and Ríos-Rull (2019) shows that unsecured credit does not smooth aggregate fluctuations in consumption over the business cycle. Although credit does not smooth aggregate consumption fluctuations by itself, I find that it does amplify the extent to which cyclical UI policies stabilize consumption over the business cycle. The mechanism driving this result is that extensions in the duration of UI promote more unsecured credit during recessions, which allows households to better smooth consumption.

# 5.b The Effects of Business Cycle Fluctuations

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How important are business cycle fluctuations for understanding the relationship between
UI and unsecured credit? It is essential to answer this question because most changes to
UI policies are counter-cyclical in the sense that they transfer more resources to households
during recessions. It is also important to know if future work on the subject needs to directly
account for business cycle fluctuations when quantifying the effects of UI policies. With these

goals in mind, I solve for a steady state equilibrium without aggregate risk. The model is the same as what is described in section 2 of the paper except that there are no fluctuations 794 between the exogenous aggregate states of the economy. When calibrating, all the acyclical 795 parameters are the same as the benchmark model, and the cyclical parameters are fixed 796 at the values for a good aggregate state  $x_q$ .<sup>29</sup> I refer to the equilibrium without aggregate 797 risk as the Deterministic Equilibrium where the benchmark model with aggregate risk is the 798 Stochastic Equilibrium. Comparing the effects of UI extensions between the two economies 799 allows me to directly quantify how cyclical fluctuations impact the relationship between UI 800 and unsecured credit. 801

Figure 4 describes the consumption-equivalent (CE) welfare gains of extending the av-802 erage duration of UI by 13 weeks in the *Deterministic Equilibrium*. Since there are no 803 cyclical fluctuations, this is a permanent change in UI policy. Without aggregate risk, the 804 main quantitative result of the paper changes. The substitutable forces dominate, and ex-805 tending the duration of UI leads to smaller welfare gains in the economy with unsecured 806 credit. The same change in results occurs whether you look at extensions in the duration of UI or increases in the replacement rate (RR). Cyclical fluctuations play a prominent role 808 in understanding the relationship between UI and unsecured credit because credit contracts 809 during recessions. These credit contractions significantly limit the extent to which house-810 holds can substitute between UI and unsecured credit for consumption insurance. Extending 811 the duration of UI during recessions not only mitigates the fall in household income, it mitigates the contraction in unsecured credit markets. By comparison, households can much 813 more easily substitute between UI and credit for consumption insurance in the *Determinis*-814 tic Equilibrium, which reduces the welfare gains of extending the duration of UI. (idea: add 815 the permanent bad aggregate state calibration to figure 4, then say "whether you calibrate 816 the model to an equilibrium with relatively high or low amounts of unsecured credit, the substitutable forces dominate when there is no aggregate risk") 818

The aggregate implications of the UI policies also differ depending on whether you account for aggregate risk. Table 5 shows the change in aggregate consumption associated

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<sup>29.</sup> For robustness, I also conduct the same policy experiment for an economy that is calibrated to use the parameter values from a bad aggregate state  $x_b$ . This does not have a significant impact on the results.

<sup>30.</sup> Compare the results to figure 3 which has the CE welfare analysis in the model with aggregate risk.

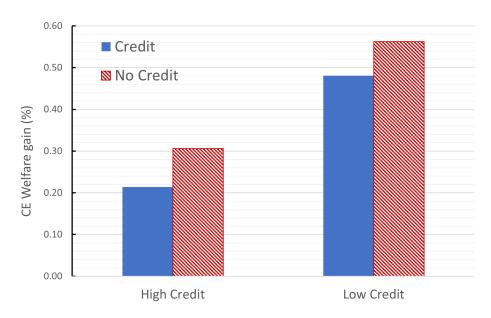


Figure 4: Welfare Effects of UI Extensions with no Aggregate Risk

Note.— Consumption equivalent (CE) welfare measured as the change in lifetime consumption a household would trade to extend the average duration of UI from 2 quarters to 3. Measured for age-1 households. *High Credit* is the equilibrium with debt:GDP of 0.23 and an unemployment rate of 5.8%. *Low Credit* is equilibrium with debt:GDP of 0.12 and unemployment rate of 9.1%.

with extending the duration of UI in the *Deterministic Equilibrium*. Without aggregate risk, UI extensions result in a smaller increase in aggregate consumption in the model with unse-822 cured credit. This is in stark contrast to the business cycle analysis, where unsecured credit 823 significantly amplified the extent to which extending the duration of UI during recessions 824 reduced the average peak-to-trough fall in aggregate consumption. It is also apparent that 825 the aggregate implications of the UI extension is quite small in the Deterministic Equilibrium. This occurs because households are relatively successful at insuring themselves with 827 precautionary savings and unsecured credit when there is no aggregate risk in the economy. 828 Therefore, extending the duration of UI has a smaller impact on aggregate consumption be-820 cause households can already smooth consumption during an unemployment spell with other 830 forms of insurance.<sup>31</sup> The aggregate implications of extending the duration of UI are much more significant in the Stochastic Equilibrium because economic agents cannot perfectly pre-832 dict when a recession will start. Therefore, households do not have as much precautionary 833

<sup>31.</sup> Table 4 details how extending the duration of UI during recessions impacts the average peak-to-trough fall in aggregate consumption and credit balances in the benchmark model with aggregate risk.

savings built up before a recession, and financial intermediaries offer terms of credit that are relatively more risky. This causes the counter-cyclical UI extensions to have a relatively large 835 impact on aggregate consumption fluctuations because households need the extra insurance 836 to better smooth their individual consumption paths and to protect against a sudden rise in 837 default risk. 838

	Credit	No Credit
Benchmark UI	3.2654	3.3013
Extended UI	3.2676	3.3043
Difference $(\%)$	0.0674	0.0909

Table 5: Aggregate Consumption without Aggregate Risk

Note.— Extended UI has average duration of 3 quarters. Credit is the economy with borrowing, and No Credit is the economy with no borrowing.

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Quantifying how cyclical fluctuations affect the relationship between UI and unsecured 839 credit makes a significant contribution to the literature because previous papers have studied this channel using a steady state analysis without aggregate risk. The most recent paper in the literature is Braxton, Herkenhoff, and Phillips (2023). Similar to my paper, their analysis 842 also has mechanisms that could generate a complementary or substitutable relationship 843 between credit and UI. They find that the government optimally reduces the RR of UI when unsecured credit is available to households, which is an indication that the substitutable 845 forces dominate in their analysis. Although I do not solve for an optimal UI policy, my 846 work also predicts that the substitutable forces dominate in a steady state environment 847 without aggregate risk because the welfare gains of UI extensions are smaller with unsecured 848 The results from my paper make a significant contribution to the literature by showing that cyclical fluctuations actually cause the relationship between UI extensions 850 and unsecured credit to change from substitutable to complementary. In an economy with empirically realistic fluctuations in unsecured credit markets, extending the duration of UI 852 during recessions has larger welfare gains and aggregate implications when unsecured credit 853 is available.

Another important difference between the current paper and Braxton, Herkenhoff, and Phillips (2023) is that the former uses one-period debt competitively priced by financial

intermediaries where the latter uses a theory of credit lines. In section 3, I showed that the theory of one-period debt is able to endogenously reproduce key empirical moments for 858 unsecured credit over the business cycle. It is unclear if a theory of credit lines could generate 850 the same moments. Herkenhoff (2019) captures cyclical fluctuations using exogenous shocks 860 to the efficiency of matching lenders to borrowers. However, exogenously generating credit 861 contractions means that UI policies have limited scope to mitigate the fall in credit balances 862 during recessions, which is a key mechanism driving results in my analysis. With lines 863 of credit, the interest rate and borrowing limit only update for borrowers that experience 864 a credit separation. To endogenously generate cyclical fluctuations in unsecured credit, 865 consumer bankruptcies, and credit card interest rates in line with the data, the theory would most likely have to rely on a high level of separations during recessions. It is largely an 867 empirical question whether there are enough credit separations over the business cycle to 868 generate realistic aggregate moments using the current theory of credit lines. This could be 869 an interesting question for future research, but given the current state of the literature, I 870 argue that one-period debt competitively priced by intermediaries is an appropriate choice for my research question. Furthermore, the current paper and Braxton, Herkenhoff, and 872 Phillips (2023) both predict that UI and unsecured credit work as substitutes in a steady 873 state equilibrium without aggregate risk indicating that the difference in results is mainly 874 driven by the inclusion of cyclical fluctuations, not the assumptions made when modeling 875 consumer credit markets.

#### <sub>77</sub> 5.c Extending the Duration vs. Increasing the Level

The US government has implemented policies which extend the duration of UI and policies which increase the level of benefits during recent recessions. The Emergency Unemployment Compensation Act of 2008 extended the maximum duration of UI to 99 weeks during the Global Financial Crisis. The Federal Pandemic Unemployment Compensation Act increased the level of weekly benefits by \$600 during the Covid-19 pandemic. However, it is unclear which policy is a more efficient use of government resources. In this section, I use the general equilibrium model of this paper to compare the effectiveness of the *Extending UI* policy to a counter-factual policy which increases the replacement rate (RR) of benefits during

recessions.<sup>32</sup> I refer to the latter as the *Increasing RR* policy. The two policies considered are budget-neutral in the sense that they generate the same average level of government expenditures over the business cycle.

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The main result from this section is that extending the duration of UI during recessions 880 has a larger impact on aggregate fluctuations than increasing the level of benefits. Table 6 890 details how the policy which increases the RR of benefits during recessions impacts the aver-891 age peak-to-trough change in consumption and unsecured credit balances over the business 892 cycle. The Increasing RR policy reduces the average fall in aggregate consumption during 893 recessions by 0.13pp. By comparison, the Extending UI policy reduced the average fall in 894 aggregate consumption by 0.42pp. You see a similar result when looking at fluctuations in unsecured credit balances. The *Increasing RR* policy reduced the fall in credit balances 896 by 0.38pp, compared to the 2.01pp reduction from the Extending UI policy.<sup>33</sup> Further-897 more, households receive more welfare from the Extending UI policy. Figure 5 shows that 898 households born in the economy with the *Increasing RR* policy would trade 0.014% of life-899 time consumption to get the Extending UI policy. Unsecured credit amplifies the difference between the two policies, but the impact of credit is relatively small. 901

The results indicating that UI extensions provide greater consumption insurance than increases in the RR of UI are related to results from Gerard and Naritomi (2021). They show that five months of UI benefits provide greater consumption insurance than equivalent severance payments regardless of whether the severance is paid out in lump-sum at layoff or monthly installments over five months. UI provides greater insurance because the payments are conditional on a worker remaining unemployed. Severance is paid to all workers who lose their job, meaning that the government must make a smaller transfer to each individual. This is one of the main driving forces for my results on counterfactual policies as well. Transfers made through extended benefits programs are conditional on a worker remaining unemployed for more than six months, whereas an increase in the RR of benefits is paid to all unemployed workers. The main difference in my analysis is the presence of unsecured credit, which I show exacerbates the difference between the two policies. Unsecured credit

<sup>32.</sup> The replacement rate increases from 0.50 to 0.62 during recessions with the counter-factual policy.

<sup>33.</sup> Appendix ?? also shows that this results holds when looking at the total deviation in aggregate variables, as opposed to the peak-to-trough change

Table 6: Peak-to-Trough Declines: Increasing Level of UI

	Benchmark		No C	<u>redit</u>
	C	D	C	D
Acyclical UI (%)	2.62	10.11	1.89	0.00
Increasing RR (%)	2.49	9.73	1.81	0.00
Difference (pp)	0.13	0.38	0.08	0.00

Note.—Peak-to-trough fall in aggregate consumption (C) and credit balances (D) averaged over all recessions in a 2000 period simulation. Peak is the period before a recession starts. Simulation results are in logs and HP filtered with a smoothing parameter of 1600. Benchmark is the economy with unsecured credit and No Credit is the economy with no borrowing.

impacts the effectiveness of these policies through both the supply side and the demand side. 914 On the supply side, figure XXX shows that there is smaller drop in the average borrowing 915 limit offered to households with UI extensions. On the demand side, households have less 916 of an incentive to delever for precautionary reasons with UI extensions because they are 917 less concerned about the possibility of not finding a job before UI expires. The precaution-918 ary deleverage channel operates in similar way to a standard precautionary savings motive 919 present in models with forward looking agents with one important difference: when income risk is high, indebted households have an incentive to delever to avoid the penalties associated 921 with a bankruptcy, in addition to the standard incentive to smooth future consumption. 922

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Although the Extending UI policy is more effective at smoothing aggregate fluctuations, it isn't clear that it is the policy which is preferred by households. Figure 5 details the CE welfare gains of switching the Extending UI policy to the Increasing RR policy: it is the share of lifetime consumption households with the former policy would trade to obtain the latter. On average, households prefer the Extending UI policy: they would trade 0.014% of lifetime consumption on average to keep the policy. However, low-income households prefer the policy which increases the RR of benefits. Therefore, the relative success of the policy may depend on the goal of the policymaker. If the goal is to smooth aggregate fluctuations, extending the duration of UI is more effective. If the goal is to have a targeted policy which benefits low-income households, increasing the level of benefits is superior.

Unsecured credit plays an important role in understanding the welfare gains of the UI policies. On average, households more strongly prefer the *Extending UI* policy in the

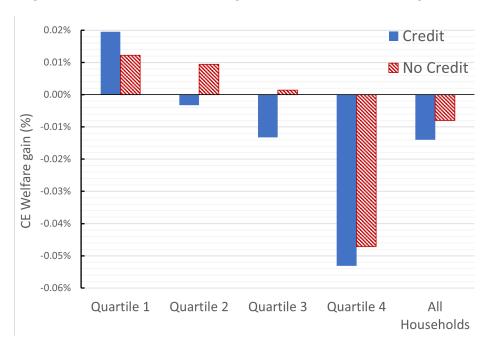


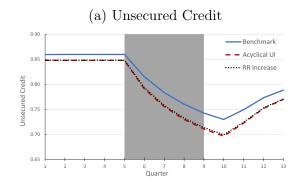
Figure 5: CE Welfare: extending the duration vs increasing the RR

Note.— Consumption equivalent (CE) welfare gains from changing UI from a policy which extends the duration during recessions to one which increases the replacement rate (RR). Positive value means household prefers increasing RR. Measured across income quartiles for age 1 households in the model.

economy with credit. This is not surprising because extending the duration of UI was much 935 more effective at minimizing the fall in unsecured credit balances during recessions. Both 936 policies have the potential to increase the supply of credit by reducing the default risk 937 premium. However, extending the duration of UI simultaneously reduces the incentive for 938 households to delever for precautionary reasons, meaning that they use the improved terms 939 of credit to borrow more and smooth consumption. Income quartile 1 is the only group of households which more strongly prefers the *Increasing RR* policy in the model with credit. 941 These households are more likely to be liquidity constrained, which means they wouldn't 942 have room for precautionary behavior. Increasing the level of UI benefits allows them to 943 increase consumption, and it reduces the risk of bankruptcy in the near-term. 944

#### 6 Conclusion

In this paper, I studied how unsecured consumer credit impacts the effectiveness of UI in insuring households against aggregate risk. To do so, I developed an incomplete markets gen-



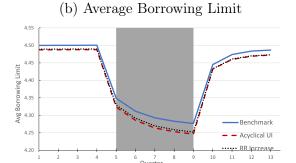


Figure 6: The Impact of UI Policies on Unsecured Credit

Note.— A five period recession starting in quarter 5. This corresponds to period 1301 in the aggregate simulation. Panel (a) is the aggregate debt balance and panel (b) is the average borrowing limit across households with good credit. UI extension extends the average duration of UI from 2 to 3 quarters during recessions. The right-hand vertical axis is the difference between the value with extensions and the value with acyclical UI.

eral equilibrium real business cycle model with frictional labor markets and defaultable debt. The model generates the cyclical properties of unsecured credit and consumer bankruptcies in the data using empirically consistent fluctuations in unemployment risk over the business cycle. This serves as a key preliminary step towards quantifying the importance of liquidity constraints and borrowing behavior for consumption smoothing in the presence of aggregate risk. I found that the majority of the volatilility in aggregate consumption, unsecured credit, and consumer bankruptcies is driven by job finding rates, as opposed to job separation rates or TFP.

The main quantitative result of this paper is that unsecured credit amplifies the welfare gains of a policy which extends the duration of UI by 13 weeks during recessions. This occurs because credit and UI act as complementary forms of consumption insurance for households. When the government extends the duration of UI, it mitigates the rise in the default-risk premium during recessions, which allows households to better smooth consumption over the business cycle. I also found that the UI policy is significantly more effective at smoothing aggregate consumption fluctuations in the economy with unsecured credit. A counterfactual policy which increases the level of benefits during recessions had a much smaller effect on aggregate consumption fluctuations, but it was preferred by low-income households.

Given the recent surge in Heterogeneous-Agent New Keynesian (HANK) models, future

research should analyze how the channels studied in the current paper impact the transmission of monetary policy. Kaplan, Moll, and Violante (2018) showed that most of the 967 transmission of monetary policy occurs through indirect effects on labor demand. A key 968 driving force to generate this result is the presence of high MPC hand-to-mouth house-969 holds who face high borrowing costs. It is essential to understand how the transmission of 970 monetary policy is affected by the presence of unsecured credit which is highly volatile and pro-cyclical because in this setting the costs of borrowing are increasing during recessions. 972 Also, the results from my paper suggest that a change in labor demand could have signif-973 icantly different aggregate implications depending on if it is being transmitted through a 974 change in hours worked, layoffs, or vacancy posting by firms. I leave these analyses to future research.

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# Appendix

# A Model Parameters

Table 7: Model Parameters

$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Description	Parameter	Value
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$		Risk Aversion	$\sigma$	2.00
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Capital Share	$\alpha$	0.35
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Income Tax	au	0.30
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Duration Bad Credit	$\theta$	0.03
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Earnings Persistence	ho	0.99
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Earnings SD	$\sigma_{\eta}$	0.10
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Patient Discount	$eta_h$	0.99
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Impatient Discount	$eta_\ell$	0.86
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Share of Patient	$\pi_\ell$	0.50
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Bankruptcy Disutility	$\chi_b$	1.20
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Credit Markup	$\iota$	0.02
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$		Work Disutility	$\chi_w$	0.14
$\begin{array}{cccccccccccccccccccccccccccccccccccc$		Search Disutility	$\chi_s$	0.14
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$		Capital Depreciation	$\delta$	0.02
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$		Share Age 1 Workers	$\Phi_E$	0.86
$ \begin{array}{c ccccccccccccccccccccccccccccccccccc$		Transfer	T	0.35
		Retirement Transfer	$T_R$	1.39
Expansion Values		UI Replacement Rate	$v_r$	0.50
Expansion Values $ \begin{array}{c} \text{Separation Rate} & \xi(x_g) & 0.04 \\ \text{Finding Rate} & \lambda(x_g) & 0.65 \\ \text{UI Duration} & v_d(x_g) & 0.50 \\ \hline \\ \text{Recession Values} & \begin{array}{c} \text{TFP} & z(x_b) & 0.97 \\ \text{Separation Rate} & \xi(x_b) & 0.05 \\ \text{Finding Rate} & \lambda(x_b) & 0.48 \\ \end{array} $		UI Max Benefit	$\overline{v}$	1.67
Expansion values Finding Rate $\lambda(x_g)$ 0.65 UI Duration $v_d(x_g)$ 0.50  TFP $z(x_b)$ 0.97  Recession Values Finding Rate $\xi(x_b)$ 0.05  Finding Rate $\lambda(x_b)$ 0.48		TFP	$z(x_g)$	1.00
Recession Values Finding Rate $\lambda(x_g)$ 0.65 UI Duration $v_d(x_g)$ 0.50	Expansion Values	Separation Rate	$\xi(x_g)$	0.04
Recession Values $TFP$ $z(x_b)$ 0.97 $\xi(x_b)$ 0.05 Finding Rate $\xi(x_b)$ 0.48	Expansion values	Finding Rate	$\lambda(x_g)$	0.65
Recession Values Separation Rate $\xi(x_b)$ 0.05 Finding Rate $\lambda(x_b)$ 0.48		UI Duration	$v_d(x_g)$	0.50
Recession Values Finding Rate $\lambda(x_b)$ 0.48		TFP	$z(x_b)$	0.97
Finding Rate $\lambda(x_b)$ 0.48	Pagagian Values	Separation Rate	$\xi(x_b)$	0.05
UI Duration $v_d(x_b)$ 0.33	necession values	Finding Rate	$\lambda(x_b)$	0.48
		UI Duration	$v_d(x_b)$	0.33

# B Data

NBER recession dates are used to pin down the aggregate transition matrix of the model economy. There are 5 recessions that occur between 1980Q1 and 2019Q4. The average

duration of a recession over this time-period is 4.6 quarters. The average duration of the 1048 expansions that lie between these recessions is 27.4 quarters. An alternative way of mapping 1049 the model to the data would be to combine the 1980 and 1981 recessions. The justification 1050 for doing so is that unemployment rates never fell during the short-lived expansion at the 1051 end of 1980. If these recessions were combined, then the persistence of recessions would 1052 increase from 0.78 to 0.82. The corresponding persistence of expansions would increase from 1053 0.96 to 0.97. Constructing the aggregate transition matrix using 4 recessions as opposed to 1054 five does not have a significant impact on the results of this paper. 1055

Table 8: Peak and Trough Quarters in US

Peak	Trough	Quarters
1980Q1	1980Q3	3
1981Q3	1982Q4	6
1990Q3	1991Q1	3
2001Q1	2001Q4	4
2007Q4	2009Q2	7

The Survey of Consumer Finances (SCF) is used to pin down the hump-shaped life 1056 cycle earnings profile in the model economy. The age-component of productivity takes the 1057 form  $\gamma_j = \nu_1 j + \nu_2 j^2$ . To estimate the age-component of earnings in the data, I regress log 1058 earnings on age, age-squared and numerous control variables. Earnings in the estimation is 1059 income from wages plus two-thirds of business income. The control variables include, sex 1060 of the head of household, race, education, education of the spouse and multiple dummy 1061 variables for occupation types. Estimating the equation for  $\gamma_j$  in every survey year from 1062 1989 to 2019, the average values for the coefficients are  $\nu_1 = 4.6e^{-2}$  and  $\nu_2 = -9.4e^{-4}$ . This 1063 setting causes households to experience hump-shaped earnings where they earn more each 1064 year through age 49 (model period 96). After this age, there are decreasing earnings each 1065 year until retirement. 1066

The SCF is also used to calculate the share of households with unsecured credit balances. Specifically, I calculate two different statistics: the debt share and the credit share. Debt share is the fraction of households who report having positive balances of credit card debt after making their last payment. Credit share is the fraction of households who have at least one credit card account. To calculate both moments, I focus on bank credit cards (Visa,

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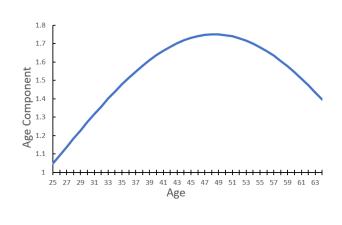
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Figure 7: Age-Component of Earnings

Survey Year	$ u_1$	$\nu_2$
1989	$5.72e^{-2}$	$-1.24e^{-3}$
1992	$4.42e^{-2}$	$-8.91e^{-4}$
1995	$4.11e^{-2}$	$-7.55e^{-4}$
1998	$5.07e^{-2}$	$-1.02e^{-3}$
2001	$4.15e^{-2}$	$-9.00e^{-4}$
2004	$4.27e^{-2}$	$-8.18e^{-4}$
2007	$4.11e^{-2}$	$-8.56e^{-4}$
2010	$4.70e^{-2}$	$-9.54e^{-4}$
2013	$4.98e^{-2}$	$-1.07e^{-3}$
2016	$4.86e^{-2}$	$-1.01e^{-3}$
2019	$3.95e^{-2}$	$-7.86e^{-4}$
Average	$4.58e^{-2}$	$-9.36e^{-4}$



Note.— Data from the Survey of Consumer Finances. Age-component of earnings takes the form  $\gamma_j = \nu_1 j + \nu_2 j^2$ . Earnings in the data is income from wages plus two-thirds of business income. Each coefficient is significant to 1.0%.

Mastercard, etc...) and observations where the head of the household is currently in the labor force. I choose to restrict attention to households in the labor force because workers who are out of the labor force are not eligible for UI. The average share of households with positive balances of credit card debt is 41.4% and the average share of households with at least one credit card is 69.2%.

Data organized by the Bureau of Labor Statistics (BLS) from the Current Population Survey (CPS) is used to pin down unemployment dynamics in the model economy. Monthly data from the CPS on employment, unemployment, and short-term unemployment (5 weeks or less) is used to calculate job separation rates and job finding rates. Job separation rates are calculated in continuous time using the methodology described in Shimer (2012), who shows that alternative methods that ignore the time aggregation problem overstate the importance of job separation rates in driving unemployment fluctuations over the business cycle. All statistics for job separation rates and job finding rates are quarterly averages of monthly data. To calculate business cycle properties, log data is HP filtered with a smoothing parameter of 1600. Detrended job separation rates have a standard deviation of 4.75 and a correlation coefficient with real GDP of -0.58. Job finding rates have a standard deviation of 7.68 and a correlation with real GDP of 0.83.

Table 9: Share of Households with Credit Card Debt

Survey Year	Debt Share	Credit Share
1983	27.44%	47.81%
1989	36.43%	61.15%
1992	40.06%	68.34%
1995	45.19%	71.77%
1998	43.91%	71.90%
2001	45.53%	77.15%
2004	46.74%	75.02%
2007	46.52%	72.27%
2010	39.13%	66.90%
2013	36.85%	66.64%
2016	43.60%	73.54%
2019	44.99%	77.74%
Average	41.37%	69.19%

Note.— Data from the SCF. Debt share is the share of households with debt after making their last payment. Credit share is share of households with at least one credit card. I restrict attention to households where the head is in the labor force.

# $_{\circ}$ C Forecasting Rules

To solve for an equilibrium with rational expectations, economic agents know the law of mo-1090 tion that governs the distribution of households. Forecasting an infinite-dimensional endoge-1091 nous state variable causes a well-established computational problem for the heterogeneous-1092 agent macro literature. This paper uses the state-space approximation method described 1093 in Krusell and Smith (1998). Specifically, the first moments for the distribution of capital 1094 and labor are used to approximate the distribution of households. These moments are suf-1095 ficient to know the equilibrium prices in the model economy. Now, forecasting the future 1096 aggregate state of the economy is achieved by forecasting the future values capital and labor. 1097 Because all employment transitions take place after production, aggregate labor is known at 1098 the beginning of the period, and agents must only forecast future labor. 1099

$$K'(x) = \nu_0^k(x) + \nu_1^k(x)\log(K) + \nu_2^k(x)\log(L)$$
(15)

$$L'(x) = \nu_0^{\ell}(x) + \nu_1^{\ell}(x)\log(L) + \nu_2^{\ell}(x)\log(K)$$
(16)

Table 10: Coefficients for Forecasting Rules

	$\nu_0$	$\nu_1$	$\nu_2$	$R^2$	Max Res.	Mean Res.
$K'(x_g)$	0.037	0.985	0.073	0.999	$3.38e^{-4}$	$5.38e^{-5}$
$K'(x_b)$	0.032	0.986	0.077	0.999	$4.32e^{-4}$	$8.30e^{-5}$
$L'(x_a)$	0.388	0.321	-0.055	0.993	$7.49e^{-4}$	$1.42e^{-4}$
$L'(x_b)$	0.251	0.491	-0.036	0.998	$6.97e^{-4}$	$2.39e^{-4}$

Note.— Coefficients for the forecasting rules described by equations (15) and (16). Results obtained using a 2300 period simulation, dropping the first 300 periods.

Equations (15) and (16) describe the forecasting rules for the first moments of capital and 1100 labor. The coefficients depend on the aggregate exogenous state of the economy x. Therefore, 1101 agents have a set of forecasting rules during expansions and a set of rules during recessions. 1102 Solving for an equilibrium in the model economy proceeds as follows. I first guess a set of 1103 values for the coefficients in the forecasting rules. I then solve for the optimal decision rules of 1104 households at each possible point in the state space. Using the decision rules, I simulate the 1105 distribution of households for a sequence of fluctuations in the aggregate exogenous state.<sup>34</sup> 1106 I calculate the first moments for the distributions of capital and labor in each period of the 1107 simulation. Given the sequences for capital and labor, I regress future capital and labor 1108 realizations using the reduced form equations described by (15) and (16). Finally, I update 1109 the guesses for the coefficients of the forecasting rules and iterate until convergence. 1110

Table 10 details the coefficients for the forecasting rules in the benchmark model economy.<sup>35</sup> As described in Krusell and Smith (1998), there is no functional form for the forecasting rules that guarantees an equilibrium solution with rational expectations. To check if the forecasting rules approximate the law of motion with sufficient accuracy, I calculate the  $R^2$  values and the residuals. The chosen functional form proves to have high accuracy, accounting for over 99% of the fluctuations in capital and labor, with maximum residuals all less less than  $8.0e^{-4}$ .

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To further check the accuracy of the forecasting rules, I use multi-period ahead forecasting errors. Specifically, I simulate capital and labor for 2300 periods using the initial values

<sup>34.</sup> In practice, I simulate the economy for 2300 periods, and I drop the first 300 periods before proceeding to the next step.

<sup>35.</sup> Each experiment has its own set of forecasting rules. I only report the coefficients for the benchmark economy to minimize the space used for the table.

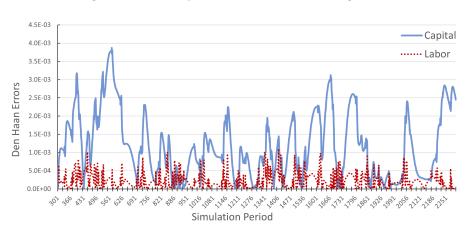


Figure 8: Multi-period ahead forecasting errors

Note.— Calculated as the difference between simulated model data, and aggregate capital and labor values obtained by simulating the forecasting rules for the same number of periods.

for capital and labor, and the forecasting rules described by equations (15) and (16). The error in each period is the difference between these sequences and the values for capital and labor from the simulated model economy. Den Haan (2010) suggests evaluating accuracy using the maximum error from the multi-period ahead forecasting test. In this model economy, the maximum error for capital is 0.38% and the maximum error for labor is 0.11%. To assess the accuracy of this model relative to the literature, I compare the errors with the two models used in Krusell and Smith (1998). In their benchmark model, the maximum error is 0.3%. In their stochastic beta model, the maximum errors is 2.0%. By comparison, the model economy in my paper proves to be highly accurate.

# D Welfare with Separable Preferences

This section derives the analytical expression for consumption-equivalent (CE) welfare described by equation (14). The welfare expression is generalized to the class of separable
preferences with CRRA utility functions for consumption. The main advantage of having
an analytical expression for welfare is that it requires no additional computational burden.
A numerical calculation of CE welfare could be quite cumbersome in a heterogeneous-agent
model with a large state space.

The welfare calculation is the share of lifetime consumption which equates the household

value function across two regimes. Let V be the value function for a household in the bench-1137 mark model economy. Similarly,  $\tilde{V}$  is the value function in the alternative model economy. 1138 For the rest of this section, I assume that the benchmark economy has the Extending UI 1139 policy, and the alternative economy has the Acyclical UI policy. Equation (17) describes the 1140 household value function in state  $(\Psi_i; \Omega)$ . For generality, I define  $v(x_i)$  to be the utility of 1141 all model elements that are not consumption; in the current model, v is the utility costs of 1142 work, search, and filing for bankruptcy. In order to calculate CE welfare, we must differen-1143 tiate between the household's value function and the value of expected future consumption. 1144 Let  $V_c$  be the value of expected future consumption streams. Similarly,  $\tilde{V}_c$  is the value of 1145 consumption streams with the Acyclical UI policy.

$$V(\Psi_j; \Omega) = E_j \sum_{i=j}^{J} \beta^{i-j} \left[ u(c_i) + v(x_i) \right]$$
 (17)

$$V_c(\Psi_j; \Omega) = E_j \sum_{i=j}^J \beta^{i-j} u(c_i)$$
(18)

Equation (19) describes the share of lifetime consumption  $\omega(\Psi_j;\Omega)$  that makes the household indifferent between the two regimes. Let  $\tilde{c}$  be consumption in the economy with the 1148 Acyclical UI policy.<sup>36</sup> Absent an analytical expression for  $\omega$ , you must solve equation (19) 1140 numerically. To begin the derivation, add the expected value of consumption streams in the 1150 alternative model economy to each side of equation (19). Then, rearrange terms and substi-1151 tute  $\tilde{V}$  and  $\tilde{V}_c$  into the equation. Finally, factor  $(1+\omega)^{1-\sigma}$  out of the consumption stream 1152 and solve for  $\omega$ . This final step is standard in analytical calculations of CE welfare with 1153 CRRA preferences. What differs from the standard calculation is the separable preferences. 1154 With separable preferences, it is necessary to save the value of consumption streams and 1155 rearrange terms before solving for  $\omega$ . 1156

$$E_{j} \sum_{i=j}^{J} \beta^{i-j} \left[ u \left( \left( 1 + \omega(\Psi_{j}; \Omega) \right) \tilde{c}_{i} \right) + v(\tilde{x}_{i}) \right] = V(\Psi_{j}; \Omega)$$
(19)

<sup>36.</sup> Let  $v(\tilde{x})$  be the utility costs of work, search, and filing for bankruptcy in the economy with the Acyclical UI policy.

$$E_{j} \sum_{i=j}^{J} \beta^{i-j} \left[ u \Big( (1 + \omega(\Psi_{j}; \Omega)) \tilde{c}_{i} \Big) + v(\tilde{x}_{i}) \right] + E_{j} \sum_{i=j}^{J} \beta^{i-j} u(\tilde{c}_{i}) = V(\Psi_{j}; \Omega) + E_{j} \sum_{i=j}^{J} \beta^{i-j} u(\tilde{c}_{i})$$

$$E_{j} \sum_{i=j}^{J} \beta^{i-j} \left[ u \Big( (1 + \omega(\Psi_{j}; \Omega)) \tilde{c}_{i} \Big) + u(\tilde{c}_{i}) + v(\tilde{x}_{i}) \right] = V(\Psi_{j}; \Omega) + \tilde{V}_{c}(\Psi_{j}; \Omega)$$

$$E_{j} \sum_{i=j}^{J} \beta^{i-j} u \Big( (1 + \omega(\Psi_{j}; \Omega)) \tilde{c}_{i} \Big) + \tilde{V}(\Psi_{j}; \Omega) = V(\Psi_{j}; \Omega) + \tilde{V}_{c}(\Psi_{j}; \Omega)$$

$$(1 + \omega(\Psi_{j}; \Omega))^{1-\sigma} \tilde{V}_{c}(\Psi_{j}; \Omega) = V(\Psi_{j}; \Omega) - \tilde{V}(\Psi_{j}; \Omega) + \tilde{V}_{c}(\Psi_{j}; \Omega)$$

$$\therefore \quad \omega(\Psi_{j}; \Omega) = \left[ \frac{V(\Psi_{j}; \Omega) - \tilde{V}(\Psi_{j}; \Omega) + \tilde{V}_{c}(\Psi_{j}; \Omega)}{\tilde{V}_{c}(\Psi_{j}; \Omega)} \right]^{\frac{1}{1-\sigma}} - 1$$

I now compare CE welfare described by equation (14) to two alternative calculations 1162 of welfare. The first alternative calculation is what I call the standard method, which is 1163 described by the equation for  $\omega_s$  below. The standard method is consumption-equivalent 1164 in a model with only CRRA utility for consumption. When there are separable preferences 1165 over leisure, this calculation is no longer consumption-equivalent. The second alternative 1166 calculation is what I call consumption only welfare, which is described by the equation for 1167  $\omega_c$  below. This calculation is specifically calculating the share of lifetime consumption that 1168 equates the value of future consumption streams between the two regimes. However, the 1169 consumption only calculation ignores the effects of leisure and the utility costs of default. 1170

$$\omega_s(\Psi_j; \Omega) = \left[\frac{V(\Psi_j; \Omega)}{\tilde{V}(\Psi_j; \Omega)}\right]^{\frac{1}{1-\sigma}} - 1; \qquad \omega_c(\Psi_j; \Omega) = \left[\frac{V_c(\Psi_j; \Omega)}{\tilde{V}_c(\Psi_j; \Omega)}\right]^{\frac{1}{1-\sigma}} - 1$$

In table 11, I replicate the results from figure 3 using the three different calculations of welfare. Regardless of the welfare calculation, the main qualitative result of this paper holds: unsecured consumer credit amplifies the welfare gains of a policy which extends the duration of UI during recessions. Moreover, the *consumption only* welfare calculation gives very similar quantitative results to the CE calculation. However, the quantitative results differ non-trivially when you use the standard method of calculating welfare. The standard method says that households would need 0.041% of lifetime consumption to be indifferent between the who polices; the CE welfare calculation says households would need 0.054%.

Table 11: Comparing Difference Welfare Calculations

	Benchmark		No Credit		<u>it</u>	
	(A)	(B)	(C)	(A)	(B)	(C)
Patient HHs	0.027	0.027	0.021	0.028	0.028	0.022
Impatient HHs	0.080	0.083	0.061	0.057	0.057	0.044
All HHs	0.054	0.055	0.041	0.043	0.043	0.033

Note.— Welfare effects of the policy which extends the duration of UI by 13 weeks during recessions. All results are percentages. Benchmark is the economy with unsecured credit. No Credit is the economy with no borrowing. (A) is CE Welfare, which is calculated by equation (14); (B) is the consumption only calculation, which is the equation for  $\omega_c$ ; (C) is the standard calculation, which is the equation for  $\omega_s$ .