

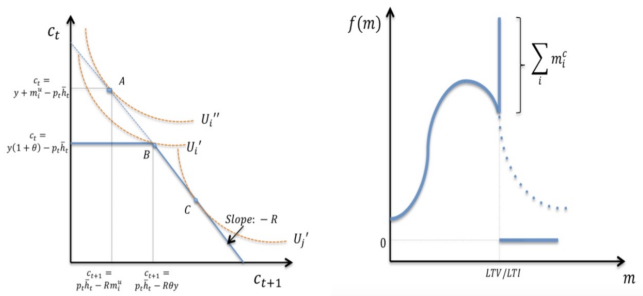
# Empirical analysis: a Bunching approach

## Implication from a model of borrowing:

(Brueckner (1994) JhE ; Defusco and Paciorek (2017) AEJ: EP ; Stein (1995) QJE ; Piazzesi Schneider (2016) NBER)

- ▶ Leverage constraints create a kink in borrowers' intertemporal budget sets.
- ▶ The kink induces bunching at the leverage limit (LTI/LTV) in the distribution of mortgages.
- ▶ The bunching mass is informative on how binding leverage constraints are.

Figure 4: (Un)constrained optimal consumption and mortgage distribution.



# Empirical analysis: a Bunching approach

**Question:** How many households are LTI-constrained?

**Procedure:** Chetty, Olsen, Pistaferri (2011) QJE

- Discretize the LTI distributions in  $J$  equally-spaced bins and run:

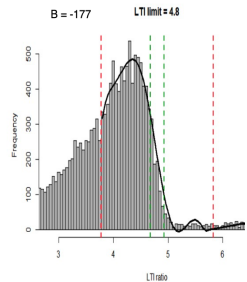
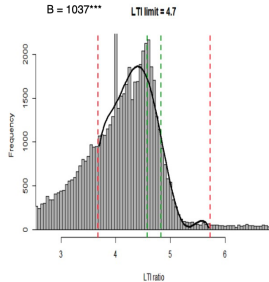
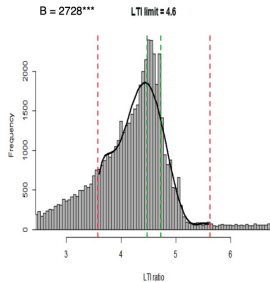
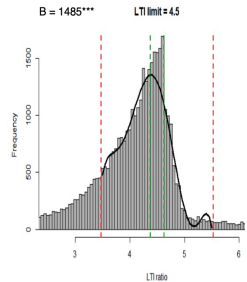
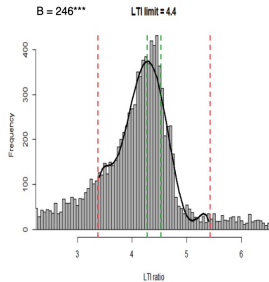
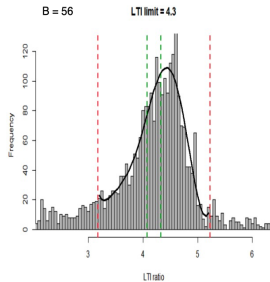
$$n_j = \sum_{i=1}^p \beta_i (z_j)^i + \sum_{s=-k}^{+k} \delta_s \mathbf{1}[z_j = z_{c+s}] + \epsilon_j \quad (1)$$

- Assuming smoothness, obtain the estimated counterfactual  $\hat{n}_j$  as the fitted value of (1) omitting the contribution of the dummies. Then, estimate bunching mass at the LTI limit as:

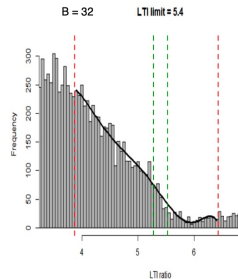
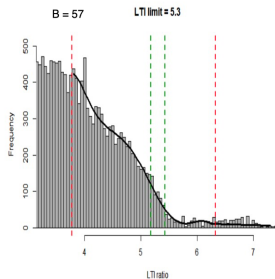
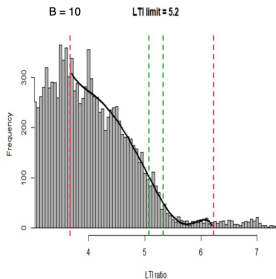
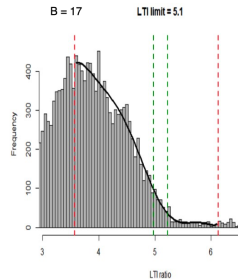
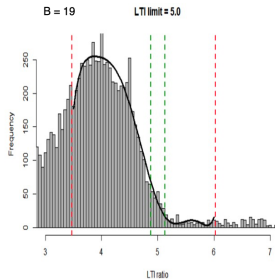
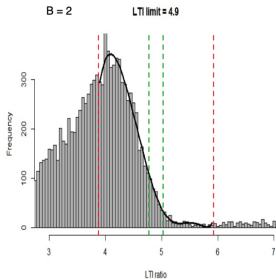
$$\hat{B} = n_j - \hat{n}_j = \sum_{s=-k}^{+k} \delta_s \mathbf{1}[z_j = z_{c+s}] \quad (2)$$

$$\hat{b} = \frac{\hat{B}}{\sum_{-k}^k \hat{n}_j / (2k + 1)} \quad (3)$$

# Empirical analysis: bunching at low LTIs



# Empirical analysis: bunching at high LTIs



# Empirical analysis: a bunching approach

What about the LTV limit?

- ▶ Same for everybody, doesn't explain the cross-section of debt.
- ▶ House price increase induces increase in borrowing capacity  
 $B.C. = p\bar{h}(1 - \delta)$

Still, there may be distributional effects of the LTV rule.

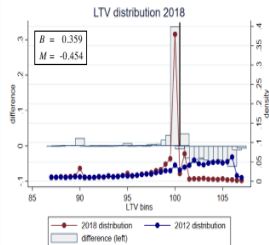
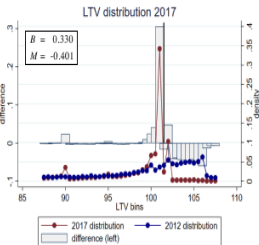
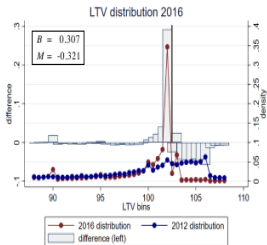
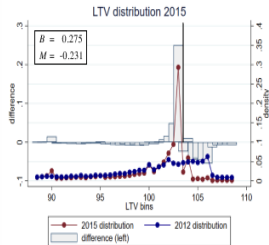
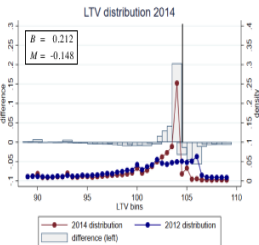
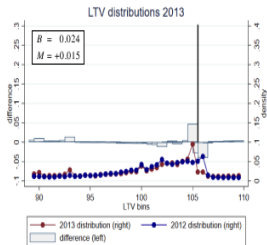
- ▶ Traditional bunching approach not very well suited
- ▶ Use pre-treatment distribution as C group.

I estimate:

$$\hat{B} = \sum_{j=-k}^k \left( \bar{n}_{c+j}^t - \bar{n}_{c+j}^0 \right) \quad ; \quad \hat{M} = \sum_{j=k+1}^J \left( \bar{n}_{c+j}^t - \bar{n}_{c+j}^0 \right)$$

Where  $\bar{n}_{c+j}^t$  is the density in bin  $c + j$  at time  $t$ .

# Empirical analysis: bunching at the LTV limit



# Conclusion

## LTI limits:

- ▶ Changes in the limits induce changes in debt take-on for low income households. High income households unaffected.
- ▶ Key role played by the (costly) "explain" option: avg. estimated cost 7 bp, low income households also more likely to explain.

## LTV limit:

- ▶ Increasing house prices lead to increasing borrowing capacity, "by construction"  $\Rightarrow$  does not limit loan *amounts* at origination.
- ▶ Still, LTV limits affect *financing* choices: further LTV tightenings induce 2x more bunching at the limit.

## House Prices:

- ▶ Additional binding factor: strong positive causal effect of house prices on household debt, comparable in size with that of the LTI limit.