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# Wages, Minimum Wages, and Price Pass-Through: The Case of McDonald's Restaurants

Orley Ashenfelter Štěpán Jurajda

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# Wages, Minimum Wages, and Price Pass-Through: The Case of McDonald's Restaurants

Orley Ashenfelter and Štěpán Jurajda

Princeton University and CERGE-EI

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#### Abstract

We use highly consistent national-coverage price and wage data to provide evidence on wage increases, labor-saving technology introduction, and price pass-through by a large low-wage employer facing minimum wage hikes. Based on 2016-2020 hourly wage rates of McDonald's Basic Crew and prices of the Big Mac sandwich collected simultaneously from almost all US McDonald's restaurants, we find that in about 25% of instances of minimum wage increases, restaurants display a tendency to keep constant their wage 'premium' above the increasing minimum wage. Higher minimum wages are not associated with faster adoption of touch-screen ordering, and there is near-full price pass-through of minimum wages, with little heterogeneity related to how binding minimum wage increases are for restaurants. Minimum wage hikes lead to increases in real wages (expressed in Big Macs an hour of Basic Crew work can buy) that are one fifth lower than the corresponding increases in nominal wages.

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Address Ashenfelter: Industrial Relations Section, Princeton University, Princeton, NJ 08544-2098, USA. e-mail: <u>c6789@Princeton.edu</u> Jurajda: CERGE-EI, a joint workplace of Center for Economic Research and Graduate Education, Charles University and the Economics Institute of the Czech Academy of Sciences, Politickych veznu 7, P.O. Box 882, 111 21 Prague 1, Czech Republic.. e-mail: <u>stepan.jurajda@cerge-ei.cz</u>

### 1. Introduction

Minimum wage legislation aims at raising real incomes of low-wage workers, most of whom are employed in the retail and hospitality industries. In this paper, we offer evidence on minimum wages from a new data set we have collected covering almost all of the US restaurants in the McDonald's chain.

The pay levels in McDonald's restaurants, the largest U.S. franchise chain, are powerfully affected by minimum wage legislation.<sup>1</sup> McDonald's restaurants are highly standardized in terms of technology and working conditions, which facilitates the cross-area and cross-time comparisons involved in the study of minimum wage effects.<sup>2</sup>

We first use our rich, highly consistent national-coverage data to study the structure of wage increases in response to minimum wage hikes. The flurry of minimum wage increases at the state and local level in the last few years provides us with a natural workshop for studying their effects. Based on information on the hourly wage rates of McDonald's Basic Crew from about 10 thousand restaurants observed annually from 2016 to 2020, we estimate an elasticity of hourly wage rates with respect to minimum wages of about 0.7. Surprisingly, this elasticity is the same for restaurants for which minimum wage increases were binding and those that were not. Underneath this elasticity, there are heterogeneous wage responses: In almost 40% of instances when minimum wages increase, McDonald's restaurants' wages are near the effective minimum wage level both before and after its increase. Such wage paths are consistent with the simple neoclassical model of labor markets. However, in a similarly large group of instances, restaurants increase their pay more than required by the increase in minimum wages. We document a tendency among these restaurants to preserve their pay 'premium' above the (increasing) minimum wage level. This suggests cross-employer pay norms are important even in entry-level low-skilled jobs; future research is needed to understand the source of these norms.

We then study whether employers substitute capital for labor when the price of low-skill labor increases due to minimum wage hikes. To provide insight into this issue within the fast food

<sup>&</sup>lt;sup>1</sup> In 2016 almost half of McDonald's Basic Crew wage rates in the US were equal to the effective local minimum wage level, i.e., at the maximum of the federal, the state, and the local minimum wage.

<sup>&</sup>lt;sup>2</sup> It is plausible that McDonald's restaurants react to higher labor costs in part by adjusting the quality of service or the cleanliness of the restaurants. However, such adjustments are limited by the nature of the detailed operating manual, which is designed to minimize costs to the brand name. In addition, the highly regimented operation of McDonald's restaurants allows for little variation in the labor share.

industry, we study a recently developed labor-saving technology in McDonald's restaurants: the introduction of touch-screen ordering kiosks. These were available in one fifth of McDonald's restaurants in 2017, but were available in close to three-fourths by 2019. Our data do not indicate that the introduction of this technology was related to minimum wage increases. This evidence is not consistent with technology introduction being a channel for negative employment effects of minimum wages.

Next, we measure the ability of McDonald's restaurants to pass through the higher costs of labor induced by changes in minimum wages during 2016 to 2020 onto their customers in the form of higher prices of the Big Mac sandwich. We use minimum wages increases as instrumental variable and find a 0.2 price elasticity with respect to wage increases. Together with the 0.7 (first-stage) elasticity of wage rates with respect to minimum wages, this implies a reduced-form elasticity of prices with respect to minimum wages of about 0.14. We uncover a full or near-full price pass-through of minimum-wage-induced higher costs of labor and find no evidence that this pass-through elasticity varies with exposure to minimum wage increases or across varying degrees of product market competition.

Finally, we employ a listing of all US McDonald's restaurants from 2010 to 2020 to estimate the effects of minimum wages on McDonald's restaurant entry and exit. We find no effects on either entry or exit based on various identification strategies. This implies that our analyses of wage effects and price pass-through are not influenced by the composition of the restaurants in our sample.

Unlike Card and Krueger's (1994, 1995) seminal work, we do not offer evidence on employment effects of the minimum wage. Our findings do not rule out employment effects, but our evidence on wage increases, technology introduction, and price pass-through is consistent with studies that find no or small minimum-wage employment effects in the fast food industry.

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# 2. US McDonald's in Our Data

During 2010-2020, there were about 14 thousand McDonald's restaurants in the US according to our first data source-the annual geo-coded listing of all McDonald's restaurants, which includes information on restaurant type (freestanding vs. part of a mall or Walmart).<sup>3</sup> We rely on this listing in our restaurant entry/exit analysis and we also use it as the population for our 2016-2020 annual telephone survey of McDonald's restaurants, our second data source. In the survey, we collect prices of the Big Mac sandwich (including sales tax and excluding temporary promotions) and wage rates of the Basic Crew (for day shift entry-level crew members aged 18 or older who finished initial training), which we will refer to as McWages. In 2016, the survey collected information from 80% of all US McDonald's restaurants and coved 2,255 US counties with 97% of the US population. The restaurant coverage rate gradually declined from 80% in 2016 to 71% in 2020, but the data cover at least 90% of US counties with a McDonald's in every year of the survey thanks to a generally high response rate. Across the five survey years, there are 52,281 restaurant-year observations.<sup>4</sup> In Ashenfelter and Jurajda (2020), we introduce the survey in more detail and use repeat interviews to estimate the annual reliability ratio of McWages and Big Mac prices to be at least 0.9. and 0.7, respectively.<sup>5</sup> Finally, we supplement the survey with the 2018 complete list of McDonald's franchises with owner identity<sup>6</sup> to classify restaurants as franchised or company-owned (10% are), and to calculate local-market indices of ownership concentration.

The structure of the McWage survey data is stable with about 10% of restaurants being company-owned in each year of the survey, 86% being free-standing restaurants, 13% being located along highways or parkways, and with 4% of the interviews being answered by a Basic Crew member (as opposed to a manager). This stability corresponds to the high response rates of our survey and the low 1.0% entry and exit rate averages measured from the 2010-2020 listing of McDonald's restaurants (see Appendix Tab A.1 and Fig. A.1).

The period from 2010 to 2020 saw a flurry of minimum wage increases across the US. Most of the three hundred increases in state or local minimum wage levels during this period

<sup>&</sup>lt;sup>3</sup> The database was obtained from AggData, a market research company.

<sup>&</sup>lt;sup>4</sup> Of these, only 720 observations come from stores that are observed only once.

<sup>&</sup>lt;sup>5</sup> The reliability ratio corresponding to annual wage changes is also about 0.9.

<sup>&</sup>lt;sup>6</sup> The database was obtained from FranData, a market research company.

occurred during 2016-2020, the period for which we have collected wage and price data.<sup>7</sup> There are 42 cities with McDonald's restaurants covered by our data that have a local minimum wage ordinance in place by 2020. The simple cross-state average of effective state minimum wages increases from \$7.43 in 2010 to \$9.20 in 2020. The average effective local minimum wage across the locations with McDonald's that by 2020 have a local minimum wage ordinance increases from \$7.90 in 2010 to \$13.90 in 2020. Despite this growth in minimum wages, the share of McWages that are censored at the local effective minimum wage declines (by 3 to 5 percentage points annually from 45% in 2016 to 30% in 2020).

To what extent do restaurant characteristics explain differences in McWages and Big Mac Prices across restaurants? The answer is, not much. In columns (1) to (4) of Table 1, we use least squares regressions to measure the explanatory power of restaurant characteristics, McWages, and state sales tax levels for the cross-restaurant variation in prices of the Big Mac. Freestanding restaurants, i.e., those that are not part of a mall or a Walmart, have prices that are about 1-2% lower, both across and within states, as documented in the first two columns of Table 1, which is based on 2018, a mid-year of our survey. The results based on other years are similar. Prices comove across locations in tandem with local sales taxes (including state sales taxes and measured as shares, i.e., 8% expressed as 0.08). In recent years, touch-screen ordering has been gradually introduced in most McDonald's restaurants (see Appendix Table A.1). Our survey asks about the presence of touch-screen ordering starting in 2017. In Table 1, we find a precisely estimated zero price coefficient corresponding to this new technology in 2018 (estimates from other years are nearly identical). In the absence of state fixed effects, we can explain only about 5% of the variation in Big Mac prices across restaurants in column (1). There is clearly much unexplained cross-restaurant variation in prices. Even conditioning on McWages and on over two thousand county fixed effects does not increase the (adjusted)  $R^2$  of the price regression above 0.5.<sup>8</sup>

<sup>&</sup>lt;sup>7</sup> For the purposes of our analysis, we consider Washington, D.C., which has more McDonald's than Vermont or North Dakota, as a US state. Our information on state and local minimum wages comes primarily from the Department of Labor and the Berkeley Labor Center. We have updated the most recent local minimum wage ordinances ourselves.

<sup>&</sup>lt;sup>8</sup> The US-wide price variation is similar in franchised and in company-owned restaurants. The McDonald's chain therefore does not apply uniform pricing, unlike grocery chains (DellaVigna and Gentzkow, 2019).

Outcome variabl		0	MacPrice)		(	Wage)
Mode			DLS			bit
	(1)	(2)	(3)	(4)	(5)	(6)
In(McWage)			0.293	0.111		
			(0.026)	(0.022)		
Restaurant is company owned	-0.007	-0.002	-0.019	-0.007	0.097	0.0711
	(0.008)	(0.007)	(0.008)	(0.007)	(0.024)	(0.011)
on highway	-0.011	0.007	0.007	0.007	-0.055	-0.005
	(0.007)	(0.003)	(0.005)	(0.004)	(0.015)	(0.005)
on parkway	-0.015	0.009	0.001	0.009	-0.030	0.010
	(0.008)	(0.005)	(0.007)	(0.005)	(0.014)	(0.009)
free standing	-0.016	-0.011	-0.011	-0.010	-0.019	-0.009
	(0.007)	(0.004)	(0.004)	(0.003)	(0.024)	(0.008)
has touch-screen ordering	0.000	0.000	-0.002	0.000	0.005	0.000
	(0.002)	(0.002)	(0.002)	(0.001)	(0.008)	(0.003)
Crew (not manager) answered	0.001	0.001	0.004	0.004	-0.021	-0.004
	(0.007)	(0.005)	(0.006)	(0.005)	(0.013)	(0.008)
Local effective sales tax rate	0.866	1.491	0.813	1.353		
	(0.472)	(0.246)	(0.222)	(0.184)		
State fixed effects	Ν	Y	Ν	Y	Ν	Y
Adj. R2 / Tobit Sigma	0.05	0.38	0.27	0.40	0.19	0.12
Ν			10,3	84		

Tab. 1: Explaining	2018 ln(BigMacPrice	e) and <i>ln(McWage)</i>	using Restaurant	t Characteristics
			8	

Note: Standard errors in parentheses are based on clustering of residuals at the state level. Bolded coefficients are statistically significant at the 1% level.

In columns (5) and (6) of Table 1, we ask whether restaurant characteristics explain variation in McWages using a Tobit specification with variable censoring thresholds corresponding to the effective (state, county, or city) minimum wage levels. Consistent with Krueger's (1991) early work, company-owned restaurants pay higher wage rates than franchised restaurants. Touchscreen ordering is not associated with wage differences across restaurants. Overall, restaurant characteristics explain little of the overall variation as confirmed by the Tobit sigma (estimated standard error of the residuals) in Table 1, which decreases by less than. 01 when restaurant characteristics are added to either specification. Avoiding the censoring issue and using only observations that are strictly above the effective minimum wage level, the adjusted  $R^2$  of a linear regression corresponding to the specification presented in column (5) of Table 1 is 0.02.<sup>9</sup>

What is the labor cost share in McDonald's restaurants? Our understanding of McDonald's production technology is based on the McDonald's extensive operations manual and on the company's global warranty of producing identical products using standardized technology. Aaronson et al. (2018) assume that these fast food restaurants operate a Leontief production function where inputs are used in fixed proportion (without substitution) and average variable costs equal marginal costs. Approximating the relationship between prices and wages, the cross-sectional regression of *ln(BigMacPrice)* on *ln(McWage)* in column (3) of Table 1 would suggest a 30% share of labor costs in Big Mac prices.<sup>10</sup> Consistent with this estimate, Dube et al. (2010) suggest that the labor share in operating costs in the US restaurant sector is about 30%.<sup>11</sup>

#### 3. Theory and Empirical Literature

Our analysis is related to four distinct parts of the minimum wage literature, which reflects alternative assumptions about the type of labor market and product market competition faced by employers who react to higher labor costs due to minimum wage legislation. Although Card and Krueger (1994) did not find evidence of any spillover of minimum wage increases on other wages, subsequent work has documented that minimum wage hikes are often associated with a positive spillover (or "ripple effect") on wages above the new minimum. The research measuring such ripple effects (e.g., Cenzig et al., 2019) often refers to models featuring labor market frictions, where such wage spillovers may reflect the value of outside options or within-firm pay norms (Flinn 2006). Our McWage evidence, which focuses on highly comparable jobs, speaks to across-

<sup>&</sup>lt;sup>9</sup> In 2020, 84% of the surveyed restaurants operate only through drive-through and delivery service due to the Covid-19 pandemic. In specifications corresponding to Table 1, we find precisely estimated zero coefficients of these operation restrictions on prices as well as wages when conditioning on state fixed effects. This conclusion is not affected by instrumenting for the presence of operation restrictions using county-level Covid-19 deaths until the end of September 2020.

<sup>&</sup>lt;sup>10</sup> When we additionally condition on the effective minimum wage level (state and local), the minimum wage coefficients correspond to about half of the McWage coefficient from column (3) of Table 1.

<sup>&</sup>lt;sup>11</sup> Under the additive input costs assumption, Parsley and Wei (2007) use international (city-level) price data on the Big Mac and all of its inputs (ingredients, rents, energy, and labor) to find that labor is by far the most important non-tradable cost, with minimal cost shares of energy and rent.

firm comparisons (pay norms) for workers providing a specific skill input under fixed hedonic job properties. It thus limits the applicability of some of the mechanisms for spillovers considered in the literature (e.g., Phelan, 2019).

The research studying the susceptibility of low-wage employment to technological substitution typically employs the task-based empirical framework. In a recent study, Aaronson and Phelan (2019) rely on minimum wage increases for plausibly exogenous variation in labor costs and find that the potential for technological substitution of low-skill labor is limited to cognitively routine tasks, i.e., it may not apply to manually routine jobs.<sup>12</sup> The advantage of our setting is that we have a direct measure of the introduction of a labor-saving technology in the form of touch-screen ordering (kiosks) in fast-food restaurants, which are facing a flurry of minimum wage hikes. We thus ask whether the timing of the technology introduction corresponds to increases in labor costs. Our analysis is narrow in that it focuses on one company, but it offers highly consistent comparisons across the geographical distribution of minimum wage increases.

The literature focusing on the price pass-through of minimum wages considers imperfect product as well as labor markets. Under monopsonistic competition in local labor markets, firms face an upward sloping labor supply curve (Manning, 2003). A small increase in minimum wages raises employment, and hence output and lowers prices, while a large increase in minimum wages cuts employment and output, and increases prices, similar to the case of fully competitive markets. An important insight for our analysis is that with constant returns to scale, firms adjust prices in response to minimum wage hikes in proportion to the cost share of minimum-wage labor (e.g., Leung, in press). If both labor and product markets are competitive, firms can pass through up to the full increase in costs (Fullerton and Metcalf, 2002). More generally, demand elasticity and demand convexity are (potentially location-specific) determinants of the pass-through (Weyl and Fabinger, 2013). Pless and van Benthem (2019) argue that under specific conditions, a pass-through rate above unity suggests the existence of market power.

There is a growing empirical literature on the price pass-through effects of minimum wages.<sup>13</sup> Much of the recent work in this area relies on food CPI indices measured at the regional

<sup>&</sup>lt;sup>12</sup> There is closely related evidence from outside of the US. For example, Hau et al. (2020) find that in privately-owned Chinese firms minimum wage hikes accelerate input substitution from labor to capital. <sup>13</sup> Card and Krueger (1994) is an early study focusing on the fast food industry. Much research studies the cost pass-through rate in retail: Ashenfelter et al. (1998) estimate the rate for a single retail chain. Recent

(e.g., MSA) level (Aaronson, 2001; Aaronson and French, 2007; Aaronson et al., 2008). The study of Basker and Khan (2016) is closely related to our analysis in that it uses 1993-2014 McDonald's Quarter-Pounder prices from about 300 US cities to uncover a 0.09 price elasticity. To learn about the degree of pass-through, Basker and Khan estimate the effect of the minimum wage on all limited-service restaurant wage bills across cities, find it to be about twice the size of the price pass-through elasticity, and argue that if the labor share of costs is about 50%, restaurants are fully passing through their cost increases to consumer prices. Similarly, Allegretto and Reich (2018) imply a near-full price pass-through of higher labor costs in internet-based restaurants in San Jose, CA. The simplest explanation for these full price pass-through findings is that both fast-food product and labor markets are competitive. Two recent analyses that also support the presence of significant price pass-through are able to exploit confidential restaurant-level payroll data from a restaurant chain: Hirsch, Kaufman, and Zelenska (2015) and Brummund (2017) use information on 80 and 515 restaurants covering 2 and 13 states, respectively. Their results are consistent with no significant employment or hours effects of minimum wage hikes even in restaurants relatively strongly affected by minimum wage increases in terms of their wage costs.

Our approach offers several advantages over the existing literature on price pass-through. First, unlike studies based on food-away-from-home CPI indices, where substitution of restaurants by consumers as well as food and service quality adjustment and tipping adjustments within restaurants are plausible responses to price increases, our approach is based on observing prices of an identical product in a setting with no tipping.<sup>14</sup> Second, our geographic coverage as well as the number of minimum wage changes we study are substantially higher compared to the recent work on price pass-through of US minimum wages. We employ extensive variation in minimum wages both at the state and local level, and are also able to focus on cross-state-border comparisons (similar to Allegretto and Reich, 2018). Third, unlike all of the minimum-wage pass-through literature, we observe store-level wage rates, which allows us to assess the wage impact of minimum wage increases. McDonald's restaurants rely heavily on its Basic Crew and these workers are likely to be affected by minimum wage legislation. Our analysis is facilitated by the

studies focus on the minimum wage price effects for identical products in US retail. Renkin et al. (in press) and Leung (in press) use bar-code scanner price data from US retail stores to reach conflicting conclusions. Renkin et al. (in press) imply full price pass through, similar to previous wholesale and retail studies. <sup>14</sup> Similar to the existing research using prices of specific fast-food items (e.g., Basker and Khan, 2016), we assume that the Big Mac price is representative of the overall price level in a store. fixed technology of production and thus constant labor cost share of McDonald's restaurants so that, unlike the existing literature, we do not estimate establishment-specific labor cost shares and can instead assume that labor's share in variable (marginal) costs is constant across restaurants. Fourth, information about owners of franchises and the geo-coded nature of our data allows us to measure the degree of franchise ownership concentration for various highly detailed geographical definitions of product markets. Our goal is thus to explore pass-through under varying degrees of product market power approximated by ownership concentration in order to contribute to the work on the impact of competition on pass-through summarized in Genakos and Pagliero (2019).

Finally, our analysis of the effects of minimum wage increases on McDonald's restaurant entry and exit extends the evidence offered in two recent studies: Aaronson et al. (2018) explore five state-level minimum wage increases and suggest these hikes increased both entry and exit of fast food restaurants. Luca and Luca (2017) rely on minimum wage hikes in cities located in the San Francisco Bay area and find that higher minimum wages lead to higher probability of closure (exit) for restaurants with lower customer ratings, but that they have no effect on the exit rate of top-rated restaurants and no discernible effect on entry. Our analysis covers the entire US and relies on over three hundred changes in effective minimum wages. On the other hand, it focuses on a fast food chain characterized by low entry and exit rates (see Section 2).

# 4. Minimum Wages and McWages

To quantify how minimum wage increases affect McWages (and to build the first step of our price pass-through analysis), we estimate the McWage elasticity with respect to minimum wages from our 2016-2020 data based on a linear equation conditioning on restaurant and year fixed effects:<sup>15</sup>

$$ln(McWage_{it}) = \alpha + \beta ln(MW_{it}) + \delta_i + \varphi_t + \varepsilon_{it}, \qquad (1)$$

<sup>&</sup>lt;sup>15</sup> The data allow us to estimate the elasticity of hourly wages with respect to minimum wages, not the elasticity of the wage bill. With prices increasing and sales declining, adjustments in hours worked could result in a wage-bill elasticity that would be lower than the wage-rate elasticity. However, Okrent and Alston (2012) suggest that demand for restaurant output is relatively price inelastic and Brummund (2017) finds no hours adjustments in response to minimum wage, reducing these concerns.

where  $MW_{it}$  stands for the effective minimum wage (federal, state, or local) faced by a McDonald's restaurant *i* in year *t*, and where  $\delta_i$  and  $\varphi_t$  represent restaurant and year fixed effects, respectively. Next, we aggregated equation (1) to the county level with county fixed effects, relying on counties with at least five observations. Using restaurant-level data in column (1) of Table 2, we uncover a 0.7 elasticity; the estimate based on county-level data in column (2) is similar. In the Appendix Table A.2, we present these specifications separately for restaurants facing minimum wage changes driven by local (city or county) minimum wage ordinances and for the majority of the data exposed to (at most) state-level minimum-wage increases. The local-variation based coefficient is somewhat smaller compared to the elasticity based on state-level variation.

rab. 2. m(merrages) and winning wages (www), 2010-20							
	(1)	(2)	(3)	(4)			
ln(MW)	0.680	0.667	0.665	0.680			
	(0.053)	(0.046)	(0.059)	(0.059)			
Affected by MW Increase			0.051	-0.057			
			(0.084)	(0.078)			
In(MW)*Affected			-0.025	0.011			
			(0.039)	(0.036)			
Observation Level	Restaurants	Counties	Restaurants	Counties			
Fixed Effects		Restaurant/C	ounty and Year				
Ν	52,281	2,658	40,739	2,273			

Tab. 2: In(McWages) and Minimum Wages (MW), 2016-20

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level. We only use county-level aggregates when there are at least 5 restaurant observations per county and year.

It is natural to ask about heterogeneity in the wage effect of minimum wage hikes with respect to how binding minimum wage increases are (see, e.g., Ashenfelter and Card, 1981). In columns (3) and (4) of Table 2, we therefore estimate specifications where we additionally control for an indicator 'Affected by *MW* Increase', which is equal to 1 when a given restaurant had to increase its wages in order to meet the new minimum wage level. The indicator stays at zero for restaurants that face no minimum wage increase or those that, as of the previous year, were already paying wages above the current increased minimum wage level.<sup>16</sup> We interact the minimum wage

<sup>&</sup>lt;sup>16</sup> We cannot determine the value of the 'Affected' indicator for restaurants not observed in consecutive years and also for restaurants observed in 2016 in locations that experienced an increase in minimum wages

with this indicator to ask whether wages react to minimum wage hikes differently in restaurants for which minimum wage hikes are binding. The estimates suggest no such interactions; we find no statistically significant differences in wage increases driven by minimum wage hikes across the 'Affected' dimension irrespective of whether we employ restaurant- or county-level data.<sup>17</sup>

That minimum wage hikes increase wages similarly below and above the new minimum wage level is strong evidence of spillovers effects. In our case, these spillovers are not due to within-firm pay norms; they correspond to standardized jobs with fixed physical productivity and hedonic job conditions. Below, we investigate the structure of the wage reaction to minimum wages in more detail.

In the 2016-2020 McDonald's survey, we observe 15,601 instances when a given restaurant is observed both before and after a minimum wage increase, corresponding to 6,585 distinct restaurants experiencing at least one minimum wage hike at the state or local level. We focus on the evolution of pay gaps between McWages and effective minimum wages across these instances. In 39% of minimum-wage-increase instances (in 6,094 instances), restaurants pay wages within 10 cents of the minimum wage both before and after its increase, i.e., they keep their wage rates at about the minimum wage level.

In another 13% of the instances of minimum wage increases (2,008 cases), we observe restaurants that paid a 'premium' of more than 10 cents above the old minimum wage increase their wages to pay within 10 cents of the new minimum wage. And in 11% of minimum-wage-hike instances (1,733 cases), restaurants do not change their pay, which is at least 10 cents above the new minimum wage level. Hence, in 63% of instances of minimum wage increases, the wage adjustment paths are consistent with simple neoclassical predictions: these firms only increase their wage rates when the failure to do so would make them out of compliance with the minimum wage law.

This leaves 37% of instances (5,766 cases), where restaurants follow pay paths that are broadly inconsistent with neoclassical predictions. In 12% of all minimum-pay-hike instances, restaurants that were at the old minimum wage level increased their pay to more than 10 cents

between 2015 and 2016. 75% of restaurants 'Affected' in 2017 pay within 5% of the new minimum wage level. Assuming that restaurants that pay McWages within 5% of an increased 2016 minimum wage were 'Affected' does not qualitatively affect the estimates. We aggregate data to the county level separately for the 'affected' and the 'non-affected' restaurants and use only data cells based on at least 5 observations.<sup>17</sup> We find similar results when we separately estimate these specifications for restaurants affected by state-level variation in minimum wages and those affected by local-level variation, see Appendix Table A.2.

above the new minimum wage. The strongest departure from neoclassical theory is then displayed in the 25% of instances (3,946 cases) where restaurants stay more than 10 cents above both the old and the new minimum wage level and increase their wages (by more than 10 cents). We now focus on this group of instances, where pay level increases by almost \$1 on average, in more detail.

Overall, of McDonald's restaurants that face at least one minimum wage hike, 36% have at least once followed such a 'non-neoclassical' wage path. This corresponds to 25% of all wage-adjustment paths. What predicts whether we observe a given restaurant behaving in this 'non-neoclassical' fashion at least once? Regressing an indicator for at least once following the strongly 'non-neoclassical' wage adjustment path on county fixed effects, an indicator for being company-owned, and a count of how many times a given restaurant had to face minimum wage increases in our sample, we find that both of the (precisely estimated) slope coefficients equal 0.08. That is, company-owned restaurants are 8% more likely to at least once behave in a non-neoclassical way, and observing a restaurant one more time facing a minimum wage increase has the same effect. Within counties, we often see both 'non-neoclassical' and 'neoclassical' paths: Across the county-year data cells with minimum wage increases where at least 10 restaurants are observed, the share of restaurants following the 'non-neoclassical' path goes from 6% at the 25<sup>th</sup> percentile to 45% at the 75<sup>th</sup> percentile. Thus, counties vary dramatically in the extent to which they contain non-neoclassical wage setters.

Using the 3,946 'non-neoclassical' wage adjustment paths and regressing the 'after' pay gap (relative to the new minimum wage level) on the 'before' gap, results in a coefficient of 0.89 (with standard error of 0.017) with an R<sup>2</sup> of 0.5. There is therefore a strong tendency to keep the pay gap (relative to the changing minimum wage level) constant. Appendix Figure A.3 supports this notion visually. The upper panel shows comparisons of the 'before' and 'after' pay gaps against the minimum wage level by states where state-wide minimum wages have gone up, while the lower graph shows this comparison based on minimum wage increases corresponding to local (city or county) minimum wage ordinances. Much of the data lies on the superimposed 45-degree line in all states; furthermore, most of the departures from the tendency to keep the gap constant are in the positive direction, i.e. restaurants increase their pay gap as minimum wages increase.

In sum, we find that when minimum wages increase, in a majority of instances, restaurants adjust their pay in line with simple neoclassical theory. However, a large group of restaurants deviates from these predictions; there is a tendency to keep the pay 'premium' against the evolving minimum wage fixed. Evidence of such minimum-wage 'ripple' effects corresponding to jobs with

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fixed productivity and hedonic job conditions extends the work on minimum wage spillovers (e.g., Cengiz, et al., 2019) and suggests across-employer pay norms may be important even for low-wage workers in standardized jobs. One possibility is that restaurants that pay wages substantially above the minimum wage level face lower levels of employee churn (and thus lower their costs of training). Alternatively, the non-neoclassical wage adjustment paths may be driven by local-market outside options. Exploring these potential explanations is outside the scope of our data, but an important topic for further research.

# 5. Minimum Wages and Labor-Saving Technology

McDonald's restaurants could respond to higher costs of labor by substituting technology for labor. A prime example of labor-saving technology adoption is the rapid introduction of touchscreen ordering kiosks, which save Basic Crew labor in the ordering process as they minimize crew-customer interaction prior to food delivery. According to our survey, touch-screen ordering availability increases from 20% of restaurants in 2017 to 73% in 2020. In Section 2, Table 1, we show that in a cross-sectional comparison, the presence of touch-screen ordering is not related to Big Mac prices or McWages. Our goal here is to use a difference-in-differences strategy to ask whether minimum wage increases affected the adoption of this technology, which would be consistent with restaurants substituting technology for more expensive labor. We thus estimate a version of equation (1) where the dependent variable is an indicator equal to 1 in the year when a given restaurant introduced touch-screen ordering.

The estimate presented in the first column of Table 3 suggests that higher minimum wages are negatively linked to the timing of touch-screen introductions, which is the opposite of the labor-capital substitution prediction.<sup>18</sup> In column (3), we obtain a similar coefficient when we estimate the same specification using data aggregated to the county-level in counties with at least 5 annual observations. In the Appendix Table A.3 we show that the negative estimate is coming from state-

<sup>&</sup>lt;sup>18</sup> In 2017, the touch-screen indicator is available for only about half of the sample. The regressions in columns (1) and (3) are based on all observations in the 2017-2020 panel when a given restaurant does not have touch-screen ordering and on the first year when touch-screen ordering is introduced; in effect, we censor restaurant observations at the moment of exit from the state 'no touch screens' as touch screens are not removed in response to minimum wages. However, the results are not sensitive to using the entire panel.

level variation in minimum wages, as opposed to corresponding to variation in local minimum wage ordinances.<sup>19</sup>

	(1)	(1) (2)		(4)	
ln(MW)	-0.179	-0.179 -0.002		-0.013	
	(0.086)	(0.031)	(0.121)	(0.045)	
Observation Level	Resta	lurants	Counties		
Sample Years	2017-20	2010,2020	2017-20	2010,2020	
Fixed Effects	Restaurar	nt and Year	County	and Year	
Ν	25,667	17,570	1,590	1,115	

Tab. 3: Touch-Screen Ordering Introduction and Minimum Wages (MW)

Note: Std. errors in parentheses. No coefficients statistically significant at the 1% level based on errors clustered at the state level. We only use county-level aggregates when there are at least 5 restaurant observations per county and year.

Annual variation in minimum wages and in touch-screen ordering during four years may offer an imperfect reflection of the long-term technology-investment considerations implied by minimum wage increases. We thus also estimate equation (1) using a decade-wide comparison. We assume that there were no touch-screen ordering kiosks installed in McDonald's restaurants in 2010. Instead of using annual variation during 2017-2020, we then employ the single longest difference available in our data based on stores observed in both 2010 and 2020.<sup>20</sup> We obtain precisely estimated zero coefficients in columns (2) and (4).<sup>21</sup> We conclude that the evidence is not consistent with higher costs of labor due to minimum wages affecting touch-screen ordering introduction.

# 6. Minimum Wage Price Pass-Through

<sup>&</sup>lt;sup>19</sup> When we estimate these specifications separately for company-owned and franchised restaurants, two groups of restaurants that share a similar aggregate evolution of touch-screen adoption in our survey, we find that the negative effect comes from the latter sub-sample, while we obtain a statistically imprecise positive coefficient for company-owned stores.

<sup>&</sup>lt;sup>20</sup> We observe restaurants operating in 2010 in our 2010-2020 panel of McDonald's locations.

<sup>&</sup>lt;sup>21</sup> Using 2015 instead of 2010 results in almost identical estimates. We also find no statistically or economically significant interactions with the 'Affected' indicator. When we control for Covid-19 operation restrictions in 2020 and their interaction with minimum wages, we again find no significant effects.

In the third step of our analysis, we provide insight into the minimum-wage price passthrough by taking advantage of the 2016-2020 data on prices and wages from each restaurant. We quantify the relationship between wage variation driven by minimum wage increases and prices, i.e., we estimate a two-stage least squares regression of prices on wages where wages are instrumented using minimum wages. The first stage of our system, corresponding to equation (1), was presented in Table 2. The second stage is given by the following equation:

$$ln(BigMacPrice_{it}) = \alpha + \beta ln(McWage_{it}) + \delta_i + \varphi_t + \varepsilon_{it}, \qquad (2)$$

where  $ln(BigMacPrice)_{it}$  stands for the logarithm of the price of the Big Mac sandwich in a McDonald's restaurant *i* in year *t*, and where we again control for both year and restaurant fixed effects. In columns (1) and (2) of Table 4, we present these 2SLS specifications corresponding to equation (2) estimated from restaurant- and county-level data, respectively.

	(1)	(2)	(3)	(4)			
IVed In(McWage)	0.202	0.194	0.200	0.186			
	(0.043)	(0.057)	(0.057)	(0.073)			
Affected by MW Increase			-0.051	-0.049			
			(0.024)	(0.047)			
IVed In(McWage)*Affected			0.022	0.022			
			(0.020)	(0.020)			
Observation Level	Restaurants	Counties	Restaurants	Counties			
Fixed Effects	Restaurant/County and Year						
N	52,281	2,658	40,739	2,273			

Tab. 4: *ln(BigMacPrice)* and Instrumented McWages, 2016-20

Note: Std. errors in parentheses. The first stage for *In(McWages)* is presented in Table 2. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level. We only use county-level aggregates when there are at least 5 restaurant observations per county and year.

The elasticity of prices with respect to wage increases driven by minimum wage hikes is 0.2. Columns (3) and (4) then present the specifications allowing for the wage effect to operate differently for restaurants facing binding minimum wage increases.<sup>22</sup> In Table 2, we found no

<sup>22</sup> The first stage for the *ln(McWage)*\*Affected interaction term is not shown.

statistically significant differences in wage increases driven by minimum wage hikes across the 'Affected' dimension. Here, we find no such interaction in the relationship between prices and wage increases driven by minimum wages.

The 'structural' *ln(McWage)* coefficient in Table 4 suggests a labor cost share of about 0.2, which, together with the first-stage wage elasticity with respect to minimum wages of about 0.7, implies a price pass-through of 0.14. This is indeed born out in Table 5, where we present the central object of the minimum-wage price pass-through literature—the reduced-form relationship between prices and minimum wages:

$$ln(BigMacPrice_{it}) = \alpha + \beta ln(MW_{it}) + \delta_i + \varphi_t + \varepsilon_{it}.$$
(3)

	(1)	(2)	(3)	(4)		
ln(MW)	0.138	0.124	0.131	0.127		
	(0.031)	(0.042)	(0.041)	(0.052)		
Affected by MW Increase			-0.042	-0.043		
			(0.027)	(0.033)		
In(MW)*Affected			0.017	0.017		
			(0.011)	(0.014)		
Observation Level	Restaurants	Counties	Restaurants	Counties		
Fixed Effects	Restaurant/County and Year					
Ν	52,281	2,659	40,739	2,273		

Tab. 5: *ln(BigMacPrice)* and Minimum Wages (MW), 2016-20

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level. We only use county-level aggregates when there are at least 5 restaurant observations per county and year.

That restaurants, which already paid a wage rate above the newly increased minimum wage level, increase their wages similarly to restaurants that were paying below the new minimum wage level in the previous year is consistent with the lack of an interaction with being 'Affected' estimated in Table 5. The estimates based on restaurant-level data are again highly similar to those based on county aggregates. When we estimated the specifications shown in Tables 4 and 5 separately for restaurants facing local minimum wage changes and for the majority of the data exposed to, at most, state-level minimum-wage increases, we obtained similar, statistically indistinguishable results (see Appendix Tables A.4 and A.5).

Our estimated price pass-through elasticity is higher than the 0.1 elasticity typically found in previous studies discussed in Section 3. Taking the 0.2 coefficient from Table 4 as the value of the labor cost share implies (by indirect least squares logic) a full price pass through. Under the higher 30% labor costs share estimate of Dube et al. (2010), if labor costs increases were to be passed through fully into prices, one would expect prices to increase by 3% for every 10% increase in minimum wages times the minimum wage elasticity of the wage bill. In our case, 30% of the 0.68 'first stage' minimum wage elasticity of McWages equals 0.2. Our reduced-form price pass-through coefficient of 0.14 would thus imply a 70 % pass-through. Overall, we conclude that our evidence is consistent with near-full price pass through of minimum wages in McDonald's restaurants.

One way to measure the purchasing power of McWages is to express them in the number of Big Macs an hour of Basic Crew work can buy. This is a measure of the "real wage". The precisely estimated elasticity of Big Macs per hour of work with respect to minimum wages (which is simply the difference between the elasticity of the McWage and the Big Mac Prince with respect to the minimum wage) is 0.54, which is less than the 0.68 McWage elasticity (shown in Table 2). Our evidence thus provides support for the notion that real income increases of low-wage workers brought about by minimum wages hikes may be lower than expected (MaCurdy, 2015).

In the final step of our price pass-through analysis, we explore heterogeneity in passthrough related to the degree of product market competition approximated by local ownership concentration. Figure A.2 in the Appendix visualizes the extent of variation across counties (covered by our McWage survey) in the 2018 degree of franchise ownership concentration as summarized by the Herfindahl-Hirschman Index (HHI). Since counties with only a few restaurants may imply a single owner, where we employ the HHI variation, we only use counties (product markets) with over 5 McDonald's. We do not observe changes in ownership concentration over time and assume that the market-level ownership structure is stable; hence, the HHI levels are absorbed by the estimated fixed effects. Instead of exploring the interaction with the 'Affected' indicator, we estimate equations (1) and (2) with HHI-index interactions. We find no evidence of

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any first- or second-stage interactions with ownership concentration.<sup>23</sup> The estimates are shown in the Appendix Table A.6, which also lists specifications estimated separately for restaurants affected by state- and local-level minimum wage variation.<sup>24</sup>

# 7. Minimum Wages and Restaurant Entry and Exit

In the final step of our inquiry, we ask whether our main analysis is affected by compositional effects linked to minimum wage increases. We employ a listing of all McDonald's restaurants from 2010 to 2020 to provide evidence on the effects of minimum wages on McDonald's restaurant entry and exit.

Restaurants that are unable to pass through cost increases induced by minimum wage hikes onto their customers may no longer be profitable and may have to close down. It is also plausible that the higher purchasing power of customers generated by minimum wage increases supports demand for McDonald's products and leads to new restaurants opening. If minimum wages affected the composition of McDonald's restaurants in operation, this would have implications for analyses based on such selected samples. To assess whether minimum wage increases affect McDonald's restaurant closure, we estimate a specification relating the probability of restaurant exit to minimum wages at the county level, conditioning on county and year fixed effects:<sup>25</sup>

$$Exit_{it} = \alpha + \beta \ln(MW_{it}) + \delta_i + \varphi_t + \varepsilon_{it} .$$
(4)

Here,  $Exit_{it}$  represents the exit rate in county *i* in year *t* and  $MW_{it}$  again stands for the corresponding effective minimum wage level. Next, we compute the entry regression by replacing the exit rate with an entry rate,  $Entry_{it}$ .<sup>26</sup>

<sup>&</sup>lt;sup>23</sup> These results are robust to excluding company-owned restaurants. We present results based on counties, but obtain similar effects when using markets defined as 25 km radius areas around each restaurant.
<sup>24</sup> When we estimate our specifications separately for markets (counties) in the highest/lowest tercile of county population and of market-level number of competitors (proxied by the number of Burger King, KFC and Wendy's restaurants), we again obtain statistically indistinguishable results.

<sup>&</sup>lt;sup>25</sup> The results are not sensitive to using city fixed effects for locations with local minimum wage ordinances to the extent that these do not correspond to counties.

<sup>&</sup>lt;sup>26</sup> We infer these rates from the presence of a restaurant in the annual listing from the fall of each year.

Since our 2010-2020 panel offers substantially more variation than our 2016-2020 McDonald's survey, we present separate estimates for the restaurants affected at most by state-wide increases in minimum wages and for restaurants facing increases in local (city or county) minimum wages. We also explore another identification strategy, following Dube et al. (2010).<sup>27</sup>

The estimates presented in Table 6 suggest no statistically significant effects of minimum wages on entry or exit. The exit coefficient in column (1) corresponds to a precisely estimated zero effect; the 0.013 entry coefficient in column (5), while statistically indistinguishable from zero, is no longer small.<sup>28</sup> These results are insensitive to specification changes. We estimated these specifications separately for restaurants located in areas (cities or counties) that, within our sample, introduced or increased a local minimum wage. This allowed us to ask whether minimum wage effects in these locations are different from the majority of the data that is covered only by (potential) increases in state-wide minimum wages. We obtained quantitatively as well as qualitatively indistinguishable results based on the two types of minimum-wage variation.

Outcome Variable [mean]	Exit [0.01]				Entry [0.01]				
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	
ln(MW)	-0.002	-0.010	0.003	-0.014	0.013	0.018	0.007	-0.010	
	(0.004)	(0.032)	(0.022)	(0.060)	(0.007)	(0.014)	(0.015)	(0.051)	
MW Variation Level	State	Local	State	Local	State	Local	State	Local	
Observation Level	Restau	irants	County Pairs		Restaurants		Count	y Pairs	
Fixed Effects	County a	County and Year		County-Pair-Year		County and Year		County-Pair-	
	and County						Year and	d County	
Ν	132,646	8,141	15,653	1,605	132,579	8,039	15,669	1,605	

Tab. 6: Minimum Wage (MW) Effects on McDonald's Entry and Exit, 2010-2020

Note: Std. errors in parentheses based on clustering at the state (columns (1), (2), (5), (6)) or county level. In column (3), (4), (7), and (8) the data correspond to contiguous county pairs straddling a state border or a border between counties affected by local minimum wage ordinances and their neighboring counties.

We also obtain similar estimates based on county-level aggregates when we employ the identification strategy of Dube et al. (2010), i.e., when we study gaps in entry or exit rates and in

<sup>&</sup>lt;sup>27</sup> This strategy did not lead to precisely estimated coefficients when applied to the 2016-20 data. To illustrate these imprecise estimates, we include them in the last two columns of Table A.5.

 $<sup>^{28}</sup>$  The standard deviation of ln(MW) in the entry/exit panel is 0.14. At a 0.013 slope, changing the minimum wage by one standard deviation would increase the entry rate by 0.002, about one-fifth of its average.

minimum wages within *pairs* of contiguous counties straddling a common state border. The identifying assumption corresponding to the Dube et al. (2010) strategy is that minimum wage differences within the county pairs are uncorrelated with the corresponding differences in residual entry/exit rates.

It is possible that any effects are only visible with a significant delay, especially given the low average entry and exit rates of McDonald's restaurants. The short nature of our panel does not allow us to explore the dynamics of the minimum wage effect in detail, but when we use longer differences (of two to five years) within our decade-long panel of entry and exit, we never find statistically significant effects, none of the coefficients are larger than those presented in Table 6, and most of the specifications result in precisely estimated zeros. Finally, we also obtain precisely estimated zero coefficients when using the longest comparison offered by our panel, i.e., when relying only on the decade-long gap between the earliest and the latest entry or exit rates available. This suggests longer-term effects are not present either.<sup>29</sup>

Overall, our evidence, which is based on a broader geographical coverage and more extensive minimum wage variation compared to Card and Krueger (1994), Aaronson et al. (2018) and Luca and Luca (2017), but which corresponds to restaurants that display generally low churn rates, suggests there are no effects of minimum wages (including those introduced at the local level) on McDonald's restaurant closure or entry. This finding is consistent with much of the recent literature suggesting no or small employment effects of minimum wages (e.g., Cenzig et al., 2019) and implies that our analyses presented above are not affected by compositional effects.<sup>30</sup>

<sup>&</sup>lt;sup>29</sup> Using the 2016-2020 wage data, we also interacted the minimum wage with the 'Affected' indicator (see Section 4) and found no evidence of such interactions affecting entry/exit. Similarly, we have uncovered no support for any ownership concentration interactions of the minimum wage effects on entry or exit of restaurants. We have additionally implemented an estimator based on matching a city with a local minimum wage increase to a similar city (without such increase) within a state or to the nearest similar city. These results also imply no effect on either entry or exit.

<sup>&</sup>lt;sup>30</sup> To the extent that we find positive entry effects and zero exit effects, these are consistent with reallocation towards major franchise chains from smaller firms in line with the evidence in Dustmann et al. (2020).

#### 8. Conclusions

Minimum wages powerfully affect service occupations. In 2016, almost half of McDonald's Basic Crew was paid the effective minimum wage. We find a 0.68 elasticity of McWages with respect to minimum wages and document that McDonald's restaurants increase wages in response to minimum wage hikes similarly regardless of whether minimum wage increases are binding at the restaurant level. In response to minimum wage hikes, a large group of restaurants keep their wage 'premium' above the minimum wage constant. Evidence on such minimum-wage 'ripple' effects corresponding to jobs with fixed productivity and hedonic job conditions extends the work on minimum wage spillovers and suggests across-employer pay norms related to employee churn, something that Lester (1960) and Kaufman (2010) have emphasized in the institutional literature.

We also find that McDonald's restaurants do not introduce touch-screen ordering, a potential labor-saving technology, in response to increases in labor costs driven by minimum wage hikes. Moreover, we find restaurants are able to pass nearly all of such labor cost increases onto their customers in the form of higher Big Mac prices. As a result, our evidence indicates that the elasticity of Big Macs per hour of Basic Crew work (a real wage measure) is 0.54, which is substantial, but about one-fifth lower than the 0.68 McWage elasticity.

Strong price pass-through is consistent with our finding of no effect of higher labor costs due to minimum wages on restaurant closures and with the evidence that higher minimum wages do not speed up the introduction of labor-saving technology. We cannot reject non-zero employment elasticities, but our McDonald's evidence, based on highly consistent comparisons across time and space, is in line with the growing literature suggesting that recent minimum wage increases did not affect employment in the non-tradable sector, including restaurants and retail, a sector that employs the majority of minimum wage workers in the US.

Finally, we uncover similar minimum wage effects when using variation in minimum wages driven by state-wide minimum wage increases and when relying on variation brought about by local (city or county) minimum wage increases. Our evidence thus suggests that cities may be able to tailor minimum wage policy to local economic conditions.

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# APPENDIX



Figure A.1: Annual Entry and Exit Rates (in %) of McDonald's Restaurants

Tab. A.1: McDonald's Survey Descriptive Characteristics

2016	2017	2018	2019	2020
1.489	1.520	1.552	1.579	1.576
0.099)	(0.106)	(0.102)	(0.103)	(0.106)
2.136	2.179	2.216	2256	2.298
0.119)	(0.148)	(0.167)	(0.187)	(0.201)
2.085	2.121	2.143	2.171	2.201
0.114)	(0.149)	(0.172)	(0.197)	(0.217)
0.109	0.100	0.095	0.097	0.900
0.119	0.111	0.116	0.119	0.117
0.024	0.023	0.023	0.023	0.023
0.862	0.857	0.860	0.865	0.876
	0.203	0.533	0.724	0.726
0.050	0.031	0.035	0.032	0.043
1,365	10,873	10,408	10,003	9,713
	1.489 0.099) 2.136 0.119) 2.085 0.114) 0.109 0.119 0.119 0.024 0.862	1.489       1.520         0.099)       (0.106)         2.136       2.179         0.119)       (0.148)         2.085       2.121         0.114)       (0.149)         0.109       0.100         0.119       0.111         0.024       0.023         0.862       0.857          0.203         0.050       0.031	1.489         1.520         1.552           0.099)         (0.106)         (0.102)           2.136         2.179         2.216           0.119)         (0.148)         (0.167)           2.085         2.121         2.143           0.114)         (0.149)         (0.172)           0.109         0.100         0.095           0.119         0.111         0.116           0.024         0.023         0.023           0.862         0.857         0.860            0.203         0.533           0.050         0.031         0.035	1.489         1.520         1.552         1.579           0.099)         (0.106)         (0.102)         (0.103)           2.136         2.179         2.216         2.256           0.119)         (0.148)         (0.167)         (0.187)           2.085         2.121         2.143         2.171           0.114)         (0.149)         (0.172)         (0.197)           0.109         0.100         0.095         0.097           0.119         0.111         0.116         0.119           0.024         0.023         0.023         0.023           0.862         0.857         0.860         0.865            0.203         0.533         0.724           0.050         0.031         0.035         0.032

Note: Standard deviations in parentheses.

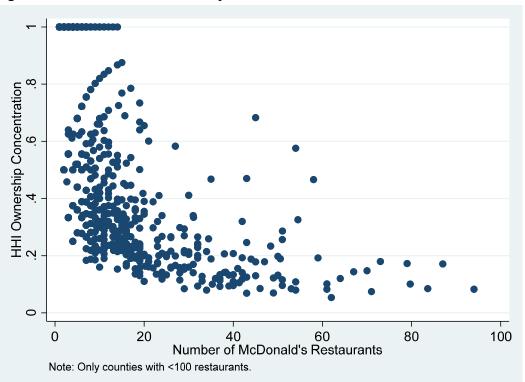
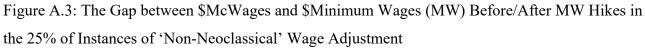
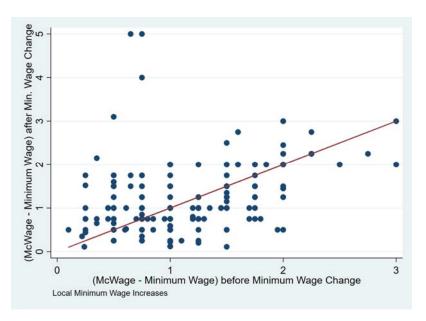


Figure A.2: McDonald's Ownership Concentration across U.S. Counties, 2018







<i>)</i> and white	innunn wag	<b>cs</b> (IVI VV), 20	10-20		
(1)	(2)	(3)	(4)		
0.685	0.503	0.666	0.556		
(0.009)	(0.032)	(0.018)	(0.045)		
		0.033	0.013		
		(0.019)	(0.077)		
		-0.017	-0.013		
		(0.009)	(0.031)		
State	Local	State	Local		
Restaurants					
Restaurant and Year					
49,750	2,530	39,171	1,568		
	(1) <b>0.685</b> (0.009) State	(1) (2) <b>0.685 0.503</b> (0.009) (0.032) State Local Resta Restaura	0.685 0.503 0.666 (0.009) (0.032) (0.018) 0.033 (0.019) -0.017 (0.009) State Local State Restaurants Restaurant and Year		

Table A.2: *ln(McWage)* and Minimum Wages (MW), 2016-20

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level.

Tab. A.3: Touch-Screen Ordering Introduction and Minimum Wages (MW), 2017-20

	(1)	(2)	(3)	(4)
ln(MW)	-0.200	0.250	-0.227	0.042
	(0.098)	(0.262)	(0.132)	(0.445)
MW Variation Level	State	Local	State	Local
Observation Level	Restau	irants	Cour	nties
Fixed Effects	Restaurant	t and Year	County a	nd Year
Ν	24,409	1,258	1,540	83

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level. We only use county-level aggregates when there are at least 5 restaurant observations per county and year.

	(1)	(2)	(3)	(4)			
	Second	Stage	Reduced Form				
ln(MW)			0.147	0.048			
			(0.036)	(0.050)			
In(McWage) IVed	0.215	0.108					
	(0.048)	(0.127)					
MW Variation Level	State	Local	State	Local			
<b>Observation Level</b>	Restaurants						
Fixed Effects		Restaurant and Year					
Ν	49,750	2,530	49,750	2,530			

Tab. A.4: *ln(BigMacPrice)* and Minimum Wages (MW), 2016-20

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level.

	(1)	(2)	(3)	(4)	(5)	(6)	(7)
ln(MW)	0.138	0.133	0.105	0.131	0.021	0.127	0.184
	(0.031)	(0.043)	(0.081)	(0.059)	(0.060)	(0.330)	(0.138)
Affected by MW Increase		0.024	-0.074	-0.050	0.010	-0.001	0.066
		(0.013)	(0.039)	(0.040)	(0.086)	(0.491)	(0.367)
In(MW)*Affected		-0.056	-0.190	0.021	-0.006	-0.007	-0.028
		(0.029)	(0.100)	(0.017)	(0.034)	(0.187)	(0.151)
MW Variation Level	All	State	Local	State	Local	State	Local
Observation Level		Restaurant	s	Counties		Count	y Pairs
Fixed Effects	Rest	Restaurant and Year		County and Year		County-	Pair-Year
					and C	County	
Ν	52,281	39,171	1,568	2,199	299	1,429	1,045

Tab. A.5: In(BigMacPrice) and Minimum Wages (MW), 2016-20

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level. In column (6) and (7) the data (and clustering) correspond to county observations for each contiguous county pair straddling a state border or a border between counties affected by local minimum wage ordinances and their neighboring counties. We only use county-level aggregates when there are at least 5 restaurant observations per county and year.

	(1)	(2)	(3)	(4)
	First Stage In(McWage)		Second Stage In(BigMacPrice)	
Outcome variable				
ln(MW)	0.685	0.503		
	(0.009)	(0.032)		
In(McWage) IVed			0.219	0.111
			(0.015)	(0.090)
ln(MW)*HHI	-0.004	-0.329		
	(0.015)	(0.213)		
In(McWage)*HHI IVed			-0.011	-0.037
			(0.022)	(0.179)
MW Variation Level	State	Local	State	Local
Observation Level	Restaurants			
Fixed Effects	Restaurant and Year			
Ν	31,383	2,348	31,383	2,348

Tab. A.6: Price Pass-Through of Minimum Wages (MW) into In(BigMacPrice) during 2016-2020

Note: Std. errors in parentheses. Bolded coefficients statistically significant at the 1% level based on errors clustered at the state level. HHI stands for the county-level Herfindahl-Hirschman Index of McDonald's ownership concentration. We only use data from counties with at least 5 restaurant observations per county and year.

#### Abstrakt

V tomto článku používáme vysoce konzistentní data o cenách a mzdách ke studiu firemních reakcí na navyšování minimálních mezd co do mzdových nárůstů, cenových nárůstů a zavádění technologií, které šetří práci. Naše analýza je založena na datech o téměř všech restauracích McDonald's v USA v letech 2016-2020. Data ukazují, že přibližně čtvrtina restaurací udržuje konstantní odstup svých hodinových mezd nad měnící se úrovní minimální mzdy. Vyšší minimální mzdy nevedou k rychlejšímu zavádění objednávání přes dotykové obrazovky, ale vedou k téměř plnému přenosu vyšších mzdových nákladů do vyšších cen. Nárůst mezd díky navyšování minimálních mezd vyjádřený v kupní síle (počtu Big Mac hamburgerů, které je možné zaplatit za hodinovou mzdu) je tak o pětinu nižší než nárůst nominální.

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