

# The Employment Impact of Autonomous Vehicles

## **Executive Summary**

The expected introduction of autonomous, or "self-driving," vehicles (AVs) promises to have a potentially profound impact on labor demand. This paper explores this potential effect by identifying the occupations most likely to be directly affected by the business adoption of autonomous vehicles.

• In 2015, 15.5 million U.S. workers were employed in occupations that could be affected (to varying degrees) by the introduction of automated vehicles. This represents about one in nine workers.

• We divide these occupations into "motor vehicle operators" and "other on-the-job drivers." Motor vehicle operators are occupations for which driving vehicles to transport persons and goods is a primary activity. In 2015, there were 3.8 million workers in these occupations. These workers were predominately male, older, less educated, and compensated less than the typical worker. Motor vehicle operator jobs are most concentrated in the transportation and warehousing sector.

• Other on-the-job drivers use roadway motor vehicles to deliver services or to travel to work sites, such as first responders, construction trades, repair and installation, and personal home care aides. In 2015, there were 11.7 million workers in these occupations and they are mostly concentrated in construction, administrative and waste management, health care, and government. Other-on-the-job drivers may be more likely to benefit from greater productivity and better working conditions offered by AVs than motor vehicle operator occupations.

By David Beede, Regina Powers, and Cassandra Ingram

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## Introduction

The expected introduction of autonomous vehicles, "self-driving" vehicles that can sense their surroundings and guide themselves without human intervention, promises to have a potentially profound impact on transportation. These vehicles offer many possible benefits to society, such as improved safety, a less burdensome travel experience, energy conservation, and reduced air pollution; and they have the potential to change many aspects of the economy, including land use patterns as well as the medical, legal, and insurance industries (Clements and Kockelman 2017). It appears that AVs will be technologically feasible at some point in the near future, and despite several challenging issues, the eventual use of them on roads is becoming more likely. In September 2016, the U.S. Department of Transportation and the National Highway Traffic Safety Administration (NHTSA) published policy guidelines for AVs, recognizing their potential as "the greatest personal transportation revolution since the popularization of the personal automobile nearly a century ago" (NHTSA 2016).

Box 1 summarizes the various stages in the evolution of vehicles from those with no automation to those that are fully autonomous. The worldwide number of advanced driver-assistance systems (ADAS), such as backup cameras and adaptive cruise control, increased from 90 million to 140 million units between 2014 and 2016. Consumers have indicated a willingness to pay \$500-\$2,500 per vehicle for ADAS. Sensor technologies are rapidly advancing to provide sophisticated information to vehicle operating systems about the surrounding environment, such as road conditions and the location of other nearby vehicles. However, slower progress has been made in developing software that can mimic human driver decision-making, so that fully autonomous vehicles may not be introduced for another ten or more years (Heineke, et al. 2017).

While much attention has focused on how AVs will impact personal mobility, they could also transform the way many businesses provide goods and services. For businesses, AVs could represent a capital investment in a labor-saving technology, with the potential to substitute for the labor currently tasked with driving. On the other hand, AVs, by improving safety or reducing travel time, may provide functions that are complementary to functions of workers in these businesses, ultimately boosting the demand for them (Autor 2015).

Previous research on automation and changes in employment suggests that the impact on labor will depend on characteristics of the services provided by the workers, such as the degree to which an occupation consists of a series of routine tasks (Frey and Osborne 2013). Therefore, although new technologies such as AVs have the potential to eliminate jobs, they can also increase demand for some tasks and perhaps lead to demand for entirely new tasks, some of which may require new skills (Bessen 2015; Autor, Levy, and Murnane 2003; Levy and Murnane 2013).

This research attempts to identify the occupations and industries that may be most directly affected by autonomous vehicles and to use available data to examine the current characteristics of these jobs and the workers who do them.<sup>1</sup> Most previous research about workers potentially affected by AVs has

<sup>&</sup>lt;sup>1</sup> In our analysis, we focus on the current use of conventional motor vehicles and human drivers to provide goods and services. This approach considers only existing jobs. Although the proliferation of autonomous vehicles may be associated with the emergence of new jobs, such as occupations involving the production, maintenance, repair and monitoring of autonomous vehicles, we do not consider those here.

focused narrowly on occupations that are classified simply as motor vehicle operators.<sup>2</sup> Below, we extend this analysis to include the many other occupations for which driving is an important, though not the primary, job activity. To simplify the analysis, we focus on workers impacted by the adoption of AVs used on roadways, such as automobiles, buses, and trucks. We consider these vehicles as distinct from specialized vehicles used in more isolated worksite environments such as construction sites, warehouses, mines, and shipyards—for example, forklifts and tractors. Specialized vehicles are customized to particular work environments, so the technological, cost, and regulatory factors that affect their adoption will likely be very different from the factors that affect the adoption of vehicles for use on open roads.

We begin by noting the industry sectors that currently rely on motor vehicles to produce services as an indication of the potential business market for AVs. We then identify driving-related occupations and the work activities associated with these occupations. Next, we examine the characteristics of these on-the-job drivers, including employment by industry, non-driving work activities, required knowledge and skills, driving-related injuries and fatalities, and economic and demographic characteristics. We also compare the characteristics of workers in driving related occupations to the characteristics of the overall workforce. These comparisons are used to help inform our understanding of driving-related jobs and the workers who do them.

<sup>&</sup>lt;sup>2</sup> One exception is Miller 2015. However, we use different specification criteria for identifying occupations, resulting in a broader group of occupations that involve driving.

## Box 1. Autonomous Vehicle Technology Is Speeding Forward

Level of Automation	Status
<ul> <li>0. No automation</li> <li>Humans perform all driving functions, but may be helped by warning systems</li> </ul>	Most cars
<ul> <li>1. Driver assistance</li> <li>Night vision</li> <li>Blind-spot detection</li> <li>Surround-view parking</li> </ul>	Now in \$20K cars
<ul> <li>2. Partial automation</li> <li>Steering</li> <li>Acceleration</li> <li>Braking in highway conditions</li> <li>Avoiding or mitigating collision impacts</li> </ul>	Now in luxury cars
<ul> <li>3. Conditional automation (systems request human intervention under difficult roadway and environmental conditions)</li> <li>Cameras</li> <li>Radar</li> <li>Light detection and ranging (lidar)</li> <li>4. High automation (system attempts to deal with difficult conditions even when requests for human intervention are ignored)</li> </ul>	Perhaps in five years
5. Full automation (under all roadway and environmental conditions that human drivers can handle, using artificial intelligence)	Perhaps in ten or more years

Source: Heineke, et al. 2017 and SAE 2014.

## **Current Motor Vehicle Use by Industry: A Baseline**

In 2016, business investments in new motor vehicles totaled \$327.5 billion, representing a little over half of total domestic final sales of new autos and trucks.<sup>3</sup> Several industry sectors rely relatively heavily on motor vehicles to deliver goods and services to consumers, and these are the industries that potentially would be most likely to adopt AVs. To identify these sectors, we use Bureau of Economic Analysis (BEA) data on the value of capital stocks and investments in private non-residential fixed assets for motor vehicles, which includes data on light trucks (including sport utility vehicles); other trucks, buses, and truck trailers; and autos.

Table 1 highlights the value of motor vehicle equipment by motor vehicle type and by major industry sector, as well as a few subsectors of interest. The value of motor vehicle equipment stocks totaled close to \$760 billion, or 11.9 percent of total equipment stocks for all industry sectors. Trucks represented about three-quarters of the total value of motor vehicle equipment stocks, and the auto

<sup>&</sup>lt;sup>3</sup> Bureau of Economic Analysis, National Income and Products Account, Motor Vehicle Output, Table 7.2.5B.

share was about one-quarter. Industries such as Construction and Transportation and Warehousing rely heavily on motor vehicles, as motor vehicles account for 29.8 and 23.0 percent of total equipment stocks in these industries, respectively.

The capital stocks of the Finance and Insurance and the Real Estate and Rental and Leasing sectors have very high motor vehicle shares, but these shares include vehicles leased out for use by households and other businesses.<sup>4</sup> U.S. accounting rules on the treatment of leased assets, including motor vehicles, make it impossible to distinguish the value of vehicles used for the operations of businesses in the Finance and Insurance and Real Estate and Rental Leasing sectors (if any) from the value of vehicles leased to households and operating leases held by businesses in other sectors.<sup>5</sup> Therefore, the estimates reported in Table 1 for the Finance and Insurance and the Real Estate and Rental and Leasing sectors likely overstate the value of motor vehicle stocks used by businesses in those sectors and understate the value of motor vehicle stocks used in other sectors.

These data indicate that businesses invest significantly in motor vehicles, suggesting that the potential demand for AVs among businesses could be sizeable. Next, we identify the jobs that would likely be affected by business adoption of AVs.

<sup>&</sup>lt;sup>4</sup> For example, General Motors Financial Company (GMFC), Inc. is a wholly-owned captive finance subsidiary of General Motors Company (GMC). GMFC offers automobile leasing services among other automobile financing products. Despite being wholly-owned by a vehicle manufacturer, data on GFMC's activities would be classified in a separate industry (NAICS 522220, Sales Financing) from that of GMC for two reasons. First, GMFC's business activities are different from those of GMC, and second, its establishments (consisting of leased credit centers, collections, and customer service centers in various locations in the US and abroad) are located separately from those of GMC. As of December 31, 2016, the net value of leased vehicles, on GFMC's balance sheet accounted for 99.1 percent of the net value of company's physical capital assets (leases were valued at \$34.5 billion, while other property and equipment were valued at about \$0.3 billion). See General Motors Financial Company, Inc. (2017). <sup>5</sup> Motor vehicle leases for periods shorter than the useful life of the asset ("operating leases") are not currently required to be reported as assets (and liabilities) on the lessee's balance sheet. New rules will require both capital and operating leases to be recognized on the balance sheet for publicly-held companies in fiscal years beginning after December 15, 2019 (Financial Accounting Standards Board 2016).

Industry Sector	Value of Light Trucks (including Utility Vehicles)	Value of Other Trucks, Buses and Truck Trailers	Value of Autos	Total Value of Motor Vehicles Equipment	Motor Vehicles Share of Total Equipment Capital Stock for Each Industry
		(Millions of	Dollars)		Percent
All Industries	335,620	211,183	212,274	759,077	11.9
Finance and insurance	108,877	10,317	107,221	226,415	40.7
Credit intermediation and related activities	105,720	9,784	105,522	221,026	46.8
Real estate and rental and leasing	72,712	24,514	52,087	149,313	30.9
Construction	34,543	13,406	11,431	59,380	29.8
Transportation and warehousing	10,647	116,486	3,111	130,244	23.0
Truck transportation	5,225	98,890	874	104,989	79.4
Transit and ground passenger transportation	2,111	10,999	1,252	14,362	75.1
Administrative and waste management services	9,057	8,945	2,570	20,572	16.6
Wholesale trade	23,356	8,144	8,619	40,119	15.6
Other services, except government	6,621	1,123	2,989	10,733	12.4
Agriculture, forestry, fishing, and hunting	18,828	6,246	3,830	28,904	8.5
Retail trade	12,166	5,527	3,740	21,433	7.7
Professional, scientific, and technical services	7,207	855	3,515	11,577	6.7
Management of companies and enterprises	1,684	206	901	2,791	5.8
Arts, entertainment, and recreation	897	1,634	219	2,750	5.2
Mining	4,616	4,654	1,159	10,429	5.0
Educational services	1,070	70	566	1,706	3.2
Accommodation and food services	2,203	148	962	3,313	2.6
Manufacturing	13,639	6,659	5,416	25,714	1.9
Health care and social assistance	4,157	591	1,997	6,745	1.6
Social assistance	1,569	449	516	2,534	21.2
Information	1,907	313	1,370	3,590	0.7
Utilities	1,433	1,345	571	3,349	0.6

## Table 1: Value and Total Share of Motor Vehicles by Industry, 2015

Note: Motor vehicles include light trucks (including utility vehicles); other trucks, buses and truck trailers; and autos.

Source: Bureau of Economic Analysis, Current-Cost Net Capital Stock of Private Nonresidential Fixed Assets for 2015.

## **Roadway Driving Occupations in the United States**

There is no dataset specifically designed to identify workers that operate or travel in motor vehicles on roadways, which is the focus of our analysis of business adoption of AVs.<sup>6</sup> The best available data for

<sup>&</sup>lt;sup>6</sup> We evaluated whether we could use the American Time Use Survey data collected by the Bureau of Labor Statistics and the American Community Survey collected by the Census Bureau, to identify the relevant set of workers, but neither survey adequately identifies on-the-job driving as distinct from commuting.

this purpose is from the Occupational Information Network (O\*NET) that includes attributes of occupations such as work activities, work context, and the use of tools and technology.<sup>7</sup> O\*NET data on work activities provides an average score, on a scale of 1 to 5, of the "importance" of 41 generalized work activities, one of which is "Operating Vehicles or Equipment."<sup>8</sup> Some occupations may involve one or more detailed work activities that fall within the generalized work activity "Operating Vehicles or Equipment" (such detailed work activities are not scored for importance). Furthermore, O\*NET data include scores for each occupation for how frequently work is performed in enclosed vehicles (e.g., automobiles) and open vehicles (e.g., tractors). Finally, O\*NET data on "tools and technology" identify occupations that use motor vehicles as a tool. While none of these variables alone fully captures occupations that involve driving, together they provide a reasonable list of those occupations that currently use roadway motor vehicles on the job and that therefore would be more likely to use AVs.

To identify roadway driving occupations, we start by using the O\*NET to flag those that perform at least one of the following detailed work activities that fall within "Operating Vehicles or Equipment:"

- 1. Drive vehicles to transport individuals or equipment.
- 2. Travel to work sites to perform installation, repair or maintenance work.
- 3. Drive vehicles to transport patrons.
- 4. Drive trucks or truck-mounted equipment.
- 5. Drive trucks or other vehicles to or at work sites.
- 6. Drive passenger vehicles.
- 7. Operate vehicles or material-moving equipment.

Because in our study we focus on occupations that use roadway vehicles, we aim to exclude occupations that primarily operate off-road vehicles or worksite materials-moving vehicles. Therefore, we also impose the additional restriction that occupations with activities 4-7 are included in our analysis only if they are also identified by O\*NET as using motor vehicles as a tool and if they spend more time in enclosed vehicles than in open vehicles. Moreover, for occupations with activity 7, which can involve operating equipment, as opposed to driving vehicles on roadways, we further require that the occupation has a high importance score for generalized activity of "Operating Vehicles or Equipment." Finally, we include occupations with high importance scores for operating vehicles or equipment and

 <sup>&</sup>lt;sup>7</sup> Depending on the topic, O\*NET data is based on surveying samples of either occupational experts or a broad range of workers from each occupation. However, relatively small survey samples can sometimes lead to noisy or inconclusive results in identifying driving-related occupations. For more information, see <a href="https://www.O\*NETonline.org/">https://www.O\*NETonline.org/</a>, <a href="https://www.O\*NETonline.org/">https://www.O\*NETcenter.org/overview.html</a>. Furthermore, while O\*NET's "substantive scope and sampling are impressive...there are also significant gaps and duplication in content. Underlying constructs, item wording, and response options are often vague or overly complex" (Handel 2016).
 <sup>8</sup>The O\*NET questionnaire asks respondents to rate the importance of an activity on a scale of 1 to 5, where 1 is "not important," 2 is "somewhat important," 3 is "important," 4 is "very important," and 5 is "extremely important." O\*NET converts this scale to a standardized score that ranges between 0 and 100, which is averaged across respondents for each occupation. The standardized score is the ratio of the difference between the actual score and the lowest possible score to the largest possible difference. For example, a score of 3 is standardized to 100 x [3-1]/[5-1] = 50. Thus, an average score of 80 indicates that the average importance score of the selected activity was 4.2, or "very important" to the performance of the job.

more time spent in enclosed vehicles even if they are not among the occupations for which O\*NET provides data on the seven detailed worked activities listed above.

Using this methodology (see Figure 1), we identify 119 roadway vehicle driving occupations in the O\*NET classification system, and we match these to 108 occupations in the 2010 Standard Occupational Classification (SOC). Appendix Table 1 shows the full list of 108 driving-related occupations and the number of workers employed in each occupation, as measured by the 2015 Occupational Employment Statistics (OES).<sup>9</sup> While it is possible to generate a slightly different list of occupations by adjusting these selection criteria, the list of occupations provides a sensible estimate of jobs that involve driving, capturing a broader set of occupations than other studies (e.g. Miller 2015, which identified 89 driving-related occupations).

Our results are also broadly consistent with recent analysis by the Bureau of Labor Statistics of its new Occupational Requirements Survey (ORS) data. BLS published ORS data on driving requirements for 163 detailed (i.e., at the six-digit SOC level) occupations in 2016,<sup>10</sup> finding that driving is "required" by some share of workers in 87 detailed occupations. However, estimates from the limited ORS sample suggest that about 30 percent of workers are required to drive on the job, which represents many more workers than shown in Appendix Table 1.<sup>11</sup> Because ORS data on additional detailed occupations is not yet available, it is not possible to fully compare the results of these findings to ours (which use data on a larger number of detailed occupations and incorporate information about the "importance" of driving rather than whether any driving at all is "required"). Still, the initial ORS findings suggest that our results may represent a conservative estimate of the number of workers affected by business adoption of AVs.

We divide our list of 108 occupations into two categories to distinguish occupations that are primarily engaged in driving from other occupations for which driving is an important, though not a primary, activity in the delivery of goods and services:

<sup>&</sup>lt;sup>9</sup> The Bureau of Labor Statistics developed the SOC as a way for Federal statistical agencies to collect and disseminate data about workers by occupational category. O\*NET uses an expanded version of the SOC called the "O\*NET-SOC Taxonomy" that divides the 840 SOC occupations into 940 more detailed occupations. Thus, since we needed the relevant set of SOC-based occupations to do the rest of our analysis, and due to these differences between the O\*NET's classification and the SOC classification, our list of 119 O\*Net occupations resulted in 108 occupations as classified by SOC. See <a href="https://www.bls.gov/soc/">https://www.bls.gov/soc/</a> for more details about the 2010 SOC and National Center for O\*NET Development 2010 for more details on the O\*NET-SOC Taxonomy. We included the entire SOC occupation if any of the O\*NET-SOC Taxonomy occupations within the corresponding SOC occupations met the requirements described above. Note that we did not include SOC occupation 53-3099, "Motor Vehicle Operators, All Other" in our vehicle operator category because O\*NET does not include the "all other" occupations listed in the SOC. To identify total employment and employment by industry, we used occupational employment data from the 2015 Occupational Employment Survey of the Bureau of Labor Statistics (see <a href="https://www.bls.gov/oes/">https://www.bls.gov/oes/</a> for more details), which included data on 813 occupations out of 840 occupations in the 2010 SOC.

<sup>&</sup>lt;sup>10</sup> BLS is phasing in collection of ORS data and by 2018 will publish data on driving requirements for a larger set of detailed occupations.

<sup>&</sup>lt;sup>11</sup>Bureau of Labor Statistics, U.S. Department of Labor, The Economics Daily, "30 percent of civilian jobs require some driving in 2016" <u>https://www.bls.gov/opub/ted/2017/30-percent-of-civilian-jobs-require-some-driving-in-2016.htm</u>

- Motor Vehicle Operators, consisting of seven occupations within the 53-3000 "Motor Vehicle • Operator" SOC group, including drivers of automobiles, trucks, buses, trains, and ambulances, and driver/salespersons (e.g., pizza deliverers).
- ٠ Other on-the-Job Drivers, which captures the remaining occupations that meet the other criteria described above. These include occupations that deliver services at multiple locations, such as first responders, home health care aides, real estate agents, and equipment installers and repairers.

### Figure 1. Driving-related Occupations

### **Roadway Vehicle Driving Occupations** 119 ONET Occupations → 108 SOC occupations

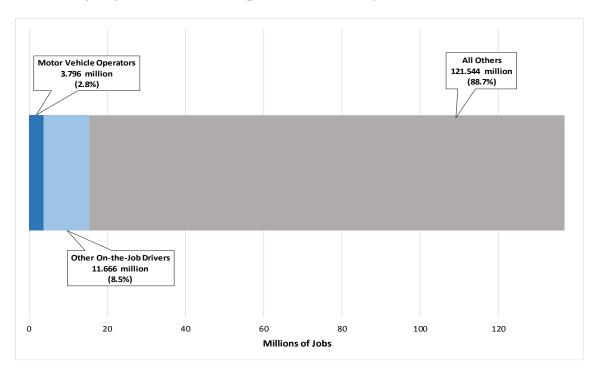
- Drive vehicles to transport individuals or equipment
   Operate vehicles or material-moving equipment if
- Travel to work sites to perform installation/repair/maintenance work
- Drive vehicles to transport patrons
- Drive trucks or truck-mounted equipment or Drive trucks/other vehicles to/at work sites or Drive passenger vehicles if
  - Use a motor vehicle and
  - More likely to operate closed than open vehicle

- - Use a motor vehicle and
  - More likely to operate closed than open vehicle and
  - Importance of operating a vehicle > 3
- Any other occupation for which
  - Closed vehicle frequency > 3 and open vehicle frequency < 3 and
  - Importance of operating a vehicle ≥ 3

Motor Vehicle Operators 7 SOC occupations		n-the-Job Drivers supations, including
 <ul> <li>Truck Drivers</li> <li>Driver/Sales Workers</li> <li>Bus Drivers</li> <li>Taxi Drivers and Chauffeurs</li> <li>Ambulance Drivers</li> </ul>	<ul> <li>Personal Care Aides</li> <li>Security Guards</li> <li>Police and Sheriff's Patrol Officers</li> <li>Automotive Service Technicians</li> <li>Electricians</li> <li>Childcare Workers</li> </ul>	<ul> <li>Correctional Officers and Jailers</li> <li>Plumbers, Pipefitters, and Steamfitters</li> <li>Firefighters</li> <li>Postal Service Mail Carriers</li> <li>HVAC Mechanics</li> <li>Emergency Medical Technicians</li> </ul>

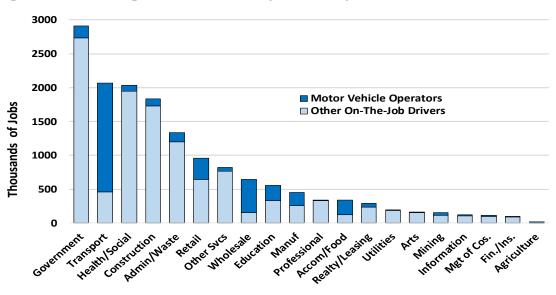
As shown in Figure 2, in 2015, there were 15.5 million jobs (11.3 percent of total occupational employment, or about one in nine workers) in driving-related occupations. There are about three times as many other on-the-job drivers as motor vehicle operators, suggesting that the impacts of AVs could extend well beyond the narrow group of workers whose occupation title includes "drivers."

Initial analysis of employment in driving-related occupations by industry shows that, not surprisingly, vehicle operator jobs are most concentrated in the transportation and warehousing ("transport") sector, while other on-the-job driving occupations are spread throughout industries, led by government, health care, construction, and administrative and waste management (see Figure 3).



### Figure 2. Employment in Driving-related Occupations

Note: Percentages are share of total occupational employment. Source: Bureau of Labor Statistics, Occupational Employment Statistics, 2015.



### Figure 3. Driving-related Jobs by Industry

Source:

Bureau of Labor Statistics, Occupational Employment Statistics, 2015.

## **Work Output of Driving Occupations**

When considering the potential impact of AVs on driving-related occupations, it is important to recognize that such occupations can involve activities other than operating motor vehicles. If those in driving-related occupations performed no work other than operating motor vehicles, then the AVs would be more likely to displace those workers as pure substitutes. Therefore, to examine the extent to which driving-related occupations involve work aside from operating vehicles, we consider the importance scores of the nine categories of activities included in "worker output" as classified by O\*NET,<sup>12</sup> one of which is "operating vehicles and equipment."<sup>13</sup> Table 2 shows the average standardized "importance" score of each category of output within each occupational group, weighted by employment in each occupation.<sup>14</sup>

#### **Motor Vehicle Operators**

For motor vehicle operators, the average importance score for operating vehicles is 86.1, much higher than the importance of other activities. While "handling and moving objects" and "performing general physical activities" are also relatively more important for motor vehicle operators than across all occupations, so are other activities that presumably require a relatively higher skill level, such as "controlling machines and processes" (other than vehicle operation) and "repair and maintenance of mechanical equipment." Thus, while the introduction of AVs could diminish the most important work output activity of motor vehicle operators, these workers engage in other activities that are relatively important in the performance of their occupation and that may continue to be performed by some humans in conjunction with AV use.

#### Other On-The-Job Drivers

For other on-the-job drivers, the importance of operating vehicles, at 58.7, is much lower than for motor vehicle operators but is still considerably greater than for all occupations. As is the case for motor vehicle operators, the importance of general physical activities; handling and moving objects;

<sup>&</sup>lt;sup>12</sup> Although these activities could be considered dimensions of labor's input into the production process, O\*NET refers to them as work output. In O\*NET terminology, "Work Output" is defined as "What physical activities are performed, what equipment and vehicles are operated/controlled, and what complex/technical activities are accomplished as job outputs?" (See <u>https://www.O\*NETonline.org/find/descriptor/browse/Work Activities/</u>.) <sup>13</sup> These output measures are listed and defined in detail in Appendix Table 2.

<sup>&</sup>lt;sup>14</sup> As a check on our classification strategy, for each occupational group that we identified, we also calculate an "importance ratio" as the importance score for operating vehicles relative to the average importance score for all other types of worker output. For motor vehicle operators, the average importance score for operating vehicles is 86.1, while the average importance score for all other output categories is 43.0, yielding a ratio of 2.0. Thus, the introduction of autonomous vehicles could diminish what is by far the most important activity of motor vehicle operators. For other on-the-job drivers, the importance of operating vehicles, at 58.7, is closer to the average importance of all other work activities, 46.7, yielding a ratio of 1.3. Given the heterogeneity of these two groups of driver occupations, some activities may be more important in some industries. Appendix Figure 1 shows that the relative importance of driving for motor vehicle drivers varies depending on the industry, ranging from 2.9 in educational services to 1.8 in several other industries. Similarly, the importance of driving for other on-the-job drivers context (on par with vehicle operators in that sector) to 1.0 in management and in professional services.

documenting and recording information; controlling machines and processes; and repairing and maintaining mechanical equipment are higher than for all occupations. Two activities, documenting and recording information and general physical activities are the most important ones for other on-the-job drivers, with importance scores higher than for motor vehicle operators. Together, these findings suggest that while driving is currently an important activity for other on-the-job drivers, other activities are also relatively important to the performance of these occupations, again suggesting that there may continue to be a role for humans to work in conjunction with AVs.

	Motor vehicle operators	Other on-the- job drivers	All occupations
Operating vehicles	86.1	58.7	30.2
General physical activities	58.7	64.0	47.9
Handling and moving objects	57.6	55.8	47.6
Documenting/recording information	57.0	68.1	59.9
Controlling machines and processes	54.3	42.0	38.2
Repairing and maintaining mechanical equipment	40.5	37.0	23.2
Interacting with computers	31.5	46.7	59.5
Repairing and maintaining electronic equipment	23.2	32.0	21.9
Drafting, laying out, specifying technical devices, parts, & equipment	20.9	28.0	18.4
Operating vehicles importance ratio	2.0	1.3	0.8

### Table 2. Relative Importance of Driving in Worker "Output"

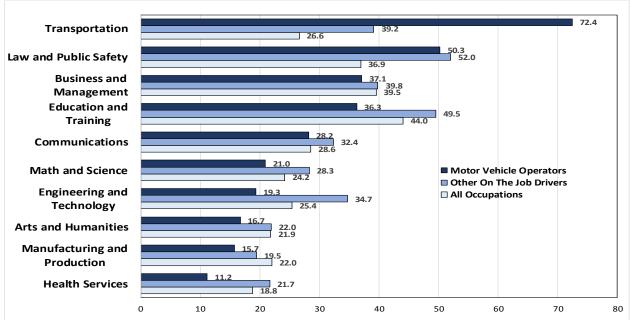
Source: O\*NET, see https://www.onetonline.org/

## **Knowledge and Skills in Driving-Related Occupations**

Another approach to understanding how workers in driving occupations may adapt to the adoption of AVs is to look at the knowledge and skills involved in these occupations. For example, comparing the knowledge and skills of motor vehicle operators to those in all other occupations might help identify deficits that may need to be addressed, possibly through public policy, to help such workers transition to other jobs as AVs become more widespread.

O\*NET provides importance scores for 33 types of "knowledge" (i.e., "organized sets of principles and facts applying in general domains") as they relate to the performance of an occupation. These categories are organized into ten broad categories. We calculate the employment-weighted average standardized importance score for each of the ten broad categories for each occupational group (motor

vehicle drivers, other on-the-job drivers, and all occupations.) As shown in Figure 4,<sup>15</sup> knowledge of transportation ("knowledge of principles and methods for moving people or goods by air, rail, sea, or road, including the relative costs and benefits") is clearly the most important category of knowledge for motor vehicle operators, followed by law and public safety. The scores for these two categories are higher than for all other occupations, but for all other categories of knowledge these scores are similar to or lower than those of all occupations. For other on-the-job drivers, transportation and law and public safety are also the most important knowledge categories, though the importance of knowledge of transportation is quite a bit lower for this category of workers than it is for motor vehicle operators.



## Figure 4: Importance Scores: Knowledge

Source: Author calculations of average importance scores by occupation, using O\*NET data on Knowledge required for each occupation, weighted by employment for each occupation, using Occupational Employment Statistics, 2015.

O\*NET also provides importance scores for 25 "cross-functional skills", i.e., "developed capacities that facilitate performance of activities that occur across jobs," organized into six broad categories. We calculate the employment-weighted average importance score for each of the broad skills categories for each occupational group.<sup>16</sup> As Figure 5 shows, although the average importance scores for each skill

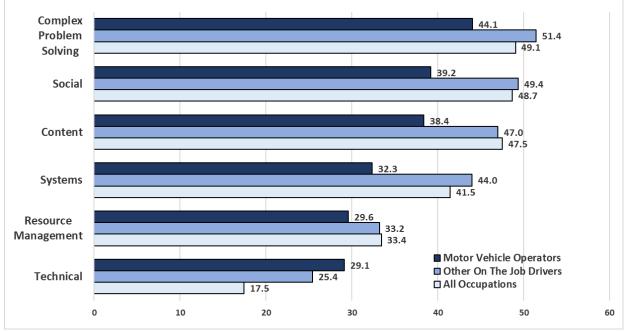
<sup>&</sup>lt;sup>15</sup> The O\*NET knowledge categories and subcategories are listed in Appendix Table 3. To obtain the average importance scores for the ten knowledge categories that we report in Figure 5, we calculate the average score for the knowledge types within each broad knowledge category, and then take an OES-employment-weighted average of each category score across all occupations within each of our three occupational groups,

<sup>&</sup>lt;sup>16</sup> The O\*NET cross-functional skill categories and subcategories are listed in Appendix Table 4. To obtain the average importance scores for the seven skills categories that we report in Figure 6, we calculate the average score for the skills within each broad skills category, and then take an OES-employment-weighted average of each category score across all occupations within each of our three occupational groups,

#### The Employment Impact of Autonomous Vehicles

category are different for each occupational group, the ranking of these skills in terms of importance is consistent across motor vehicle operators, other on-the-job drivers, and all occupations. Still, except for technical skills, which relate to operation of machines or technological systems, motor vehicle operators have lower importance scores for all cross-functional skill categories compared to both other on-the-job drivers and to all occupations. Other on-the-job drivers more closely resemble overall occupations in terms of the importance of cross functional skills, although on-the-job drivers also show a higher importance for technical skills relative to all occupations.

The findings of this section show that motor vehicle operators have higher knowledge importance scores for only a couple of categories compared to all occupations, and except for technical skills, substantially lower cross-functional skill importance scores than all occupations. In contrast, other-on-the-job drivers have higher knowledge and skills importance scores in many categories compared with motor vehicle operators. These findings suggest that motor vehicle operators may have less of a knowledge and skills base that could be transferable to other jobs, while other on-the-job drivers are likely to be more adaptable since they are more similar to all occupations in terms of knowledge and skills and less specialized in transportation knowledge than motor vehicle operators.



### Figure 5. Importance Scores: Cross Functional Skills

Source: Author calculations of average importance scores by occupation, using O\*NET data on Cross Functional Skills required for each occupation, weighted by employment for each occupation, using Occupational Employment Statistics, 2015.

## **Driving-Related Injuries and Fatalities**

We also analyzed data from the Census of Fatal Occupational Injuries and the Survey of Occupational Injuries and Illnesses to present information on the risks involved in using roadway vehicles for drivingrelated occupations and across all occupations. Table 3 shows that the fatality rate (per 100,000 fulltime equivalent workers) for motor vehicle operators from on-the-job roadway incidents involving motor vehicles is ten times the rate for all workers, and the numbers of roadway motor vehicle occupational injuries resulting in lost work time per 100,000 full-time equivalent workers is 8.7 times as large as that of all workers.

Given that driving-related fatalities and injuries are notably higher for motor vehicles operators than for other on-the-job drivers, which in turn show higher fatality and injury rates than the overall average, these data help validate our occupational classification (i.e., the more driving done on the job, the greater the risk of fatalities and injuries) and also point to the potential safety benefits of AVs.

## Table 3. On-the-job Injuries and Fatalities Involving Roadway Vehicles

	Motor vehicle operators	Other on-the-job drivers	All occupations
Risk of driving fatalities	16.1	2.2	1.6
Risk of driving injuries	479.5	125.5	55.5

Note: Rates are per 100,000 FTEs

Source: Authors' calculations, and 2011-2015 Census of Fatal Occupational Injuries and 2011-2015 Survey of Occupational Injuries and Illnesses.

## Demographic Characteristics of Workers in Driving-Related Occupations

We use data from the Occupational Employment Statistics survey, American Community Survey, and Current Population Survey Annual Social and Economic Supplement to understand better the economic and demographic characteristics for workers in both categories of driving-related occupations, as well as across all occupations. Comparing the characteristics of each occupational group helps to paint a profile of workers that could be most affected by the business adoption of AVs. Table 4 summarizes the data on worker characteristics, which are discussed below. <sup>17</sup>

#### **Motor Vehicle Operators**

In 2015, the 3.8 million motor vehicle operators accounted for a little less than three percent of workers across all occupations. Workers in vehicle operator occupations are compensated less than the overall workforce; the mean annual wage of motor vehicle operators was about \$36,500, about 25 percent lower than the mean wage of \$48,300 for all occupations. In addition:

- A particularly striking observation was that motor vehicle operators are predominately male (88.0 percent, compared to about 52.7 percent of workers overall).
- Only 7.6 percent of motor vehicle operators had a bachelor's degree or higher.
- 45.6 percent of motor vehicle operators had only a high school diploma, compared to 24.7 percent of workers overall.

Motor vehicle operators also were:

- less likely to be covered by employer-sponsored health plans. About 15.2 percent were without coverage compared to about 10.8 percent for all workers.
- less likely to have pension plans. Only about one in four were covered compared to about onethird of all workers.
- more likely to be paid by the hour, less likely to live in a metropolitan area, and more likely to be self-employed.

However, there was a considerable amount of heterogeneity in the characteristics of motor vehicle operators across the occupations that make up this category. For example, taxi drivers on average earn much less than other motor vehicle operators (about \$26,000, compared to \$33,000 for bus drivers

<sup>&</sup>lt;sup>17</sup> The American Community Survey (ACS) and Current Population Survey (CPS) data is based on the Census Bureau's occupational classification, which is less detailed than the 2010 Standard Occupational Classification (SOC) system on which the SOC-O\*NET taxonomy is based. In other words, some Census occupation codes are comprised of multiple SOC codes. This is less of a problem for motor vehicle operators because the four Census occupation codes for this group of workers comprises the seven SOC codes for motor vehicle operators (the two SOC bus driver codes and the three SOC truck driver codes were each combined into one Census occupation code for all bus drivers and one for all truck drivers). However, some of the SOC codes for other on-the-job drivers are combined with other non-driving SOC codes in the Census occupation classifications. To deal with this in the ACS and CPS data, if workers had a Census occupation code that is comprised of at least one of the SOC codes we identified them as other on-the-job drivers. Therefore, the percent of workers identified in the ACS data as being other on-the-job drivers is higher (14.3 percent) than that based on the OES data (8.5 percent). As a sensitivity check, we used OES employment data to weight the estimates based on the share of employment in drivingrelated occupations within each Census occupation code. The results were essentially the same as those shown in Table 4 and Appendix Table 5.

and \$38,000 for truck drivers). Bus drivers tend to be older, and less educated than other motor vehicle drivers, but they are much more likely to be unionized and female. See Appendix Table 5 for details.

There is even heterogeneity among bus drivers, with transit and intercity drivers earning on average about one-third more than school bus or other bus drivers, and among truck drivers, with heavy/tractor-trailer drivers earning \$42,500 on average while driver/sales workers (including food delivery workers) earn much less, about \$28,000. See Appendix Table 6 for details.

## Table 4. Demographic and Economic Characteristics of Drivers

	Motor Vehicle Operators	Other On-the- Job Drivers	All Occupations
Occupational Employment Statist	tics, 2015		
Employment (thousands of workers)	3,796	11,666	137,006
Employment Share (%)	2.8	8.5	100.0
Mean Annual Wages	\$36,500	\$46,700	\$48,300
American Community Survey, 20	15 Public Use Mici	rodata Sample	
Share of Employed Persons (%)	3.0	14.3	100.0
Median Age (years)	46	43	41
Educational Attainment			
Less than HS (%)	14.8	9.2	9.5
HS or GED (%)	45.6	27.1	24.7
Some College (%)	32.0	36.1	32.4
Bachelors Plus (%)	7.6	27.7	33.4
Unemployment Rate (%)	4.7	4.6	6.3
Male (%)	88	68.8	52.7
Race			
White (%)	70.3	76.8	74.9
Black (%)	17.6	11.4	11.5
Other (%)	12.1	11.8	13.6
Hispanic (%)	18.7	16.8	16.5
Married, spouse present (%)	53.8	53.6	49.7
Non-Citizen (%)	8.4	8.2	8.7
Self-Employed (%)	11.5	14.6	9.4
In Poverty (%)	6.3	6.3	7.1
Food Stamp Recipient (%)	12.5	9.4	9.9
Veteran (%)	11.5	8.9	5.5
No Health Insurance Coverage (%)	15.2	11.5	10.8
No Home Internet Access (%)	14.7	9.8	9.7
No Home Computer (%)	9.1	6.1	6.3
Current Population Survey Annua	l Social and Econo	mic Supplement	t, <b>20</b> 16
Worked part-time last year (%)	17.2	14.7	19.9
Paid by the hour (%)	64.7	54.1	56.4
Included in pension plan at work (%)	24.3	33.5	33.0
Union coverage (%)	17.4	17.5	12.3
Not in metro area (%)	16.2	12.1	12.5

Percentages for Educational Attainment and Race may not sum to 100.0% due to rounding.

#### **Other On-The-Job Drivers**

In 2015 there were 11.7 million other on-the-job drivers, representing 8.5 percent of workers in all occupations. On average, these workers earned slightly less than workers across all occupations (\$46,700 compared to \$48,300). These other on-the-job drivers are also slightly older, with a median age of 43 years compared to a median of 41 years across all workers.

In addition, other on-the-job drivers are:

- much more likely than motor vehicle operators to have a college degree (27.7 percent versus 7.6 percent) though less likely than all workers to have a college degree (33.4 percent).
- much more likely to be veterans compared to workers overall, but less likely compared to motor vehicle operators (8.9 percent of other on-the-job drivers are veterans, compared to 5.5 percent of all workers and 11.5 percent of motor vehicle operators).
- male dominated, though less so than for motor vehicle drivers; about 68.8 percent of the workers in the on-the-job driver occupations are male. This is compared to about 52.7 percent of workers overall being male.

## Conclusion

Although AV technology has developed rapidly in recent years, the consensus is that widespread adoption of vehicles that are "fully" automated is likely to take several more years. When this occurs, AVs may be increasingly adopted by businesses that currently use motor vehicles and human drivers as part of their production process. This paper uses the available data on the activities of various occupations to explore which ones are most related to driving and which, therefore, are more likely to be affected by the future use of AVs by businesses. This analysis provides not only a baseline indication of the activities of those jobs but also the characteristics of the workers who do them, and shows that the adoption of AVs has the potential to impact a sizable share of jobs in the economy. The extent to which AVs could eliminate certain occupations, resulting in job loss, while changing the mix of tasks involved in other occupations, is still not clear.

Nevertheless, several important findings of this report may help inform regarding the labor market impacts of the business adoption of AVs. First, our findings suggest that workers in some driving occupations might have difficulty finding alternative employment. Workers in motor vehicle operator jobs are older, less educated, and for the most part have fewer transferable skills than other workers, especially the kinds of skills required for non-routine cognitive tasks.

Second, in contrast to the workers in the occupations we classify as motor vehicle operators, other onthe-job drivers, of which there are about triple the number of motor vehicle operators, have a more diversified set of work activities, knowledge, and skills. For this group, although driving is an important work activity, it is only one of many important work activities, many of which already require the kinds of non-routine cognitive skills that are becoming increasingly in demand in our economy. Such workers are likely to be able to adapt to the widespread adoption of AVs.

As AVs are adopted by businesses, continued tracking of the number of motor vehicle operators and other driving-related jobs, as well as tracking of the work activities, skills and knowledge required in these occupations, will help indicate the extent to which AV technology will serve to substitute for labor by eliminating particular jobs or to complement labor by changing the importance of other work activities performed by those workers.

## References

- Autor, D.H. (2015). Why Are There Still So Many Jobs? The History and Future of Workplace Automation. *Journal of Economic Perspectives*, 29(3), 3-30.
- Autor, D., Levy, F., & Murnane, R.J. (2003). The Skill Content of Recent Technical Change: An Empirical Investigation. *Quarterly Journal of Economics*, 118(4), 1279-1334.
- Bessen, J. (2015). Toil and Technology. International Monetary Fund Finance and Development, 52(1), 16-19.
- Bureau of Labor Statistics, U.S. Department of Labor, *The Economics Daily*, 30 percent of civilian jobs require some driving in 2016 (<u>https://www.bls.gov/opub/ted/2017/30-percent-of-civilian-jobs-require-some-driving-in-2016.htm</u>)
- Clements, L. and Kockelman, K. (2017). Economic Effects of Automated Vehicles. *Transportation Research Board Annual Meeting, January 2017* and forthcoming in *Transportation Research Record*. (http://www.caee.utexas.edu/prof/kockelman/public\_html/TRB17EconomicEffectsofAVs.pdf)
- Financial Accounting Standards Board (2016). FASB In Focus. "Accounting Standards Update No. 2016-02, Leases (Topic 842)." (<u>http://tinyurl.com/ydgw8fbx</u>.)
- Frey, C.B. & Osborne, M.A. (2017). The Future of Employment: How Susceptible Are Jobs to Computerisation? *Technological Forecasting and Social Change*, 114, 254-280.
- General Motors Financial Company, Inc. (2017). Form 10-K, dated February 7, 2017. (<u>http://tinyurl.com/y735ljdr</u>.)
- Handel, Michael J. (2016). "The O\*NET Content Model: Strengths and Limitations. *Journal of Labour Market Research*, 49:157–176.
- Heineke, Kersten, Philipp Kampshoff, Armen Mkrtchyan, and Emily Shao. "Self-Driving Car Technology: When will the Robots Hit the Road?" May 2017.

(http://www.mckinsey.com/industries/automotive-and-assembly/our-insights/self-driving-car-technology-when-will-the-robots-hit-the-road).

Levy, F. & Murnane, R.J. (2013). *Dancing with Robots: Human Skills for Computerized Work*. Washington, DC: Third Way Foundation.

McKinsey Global Institute (2017). A Future That Works: Automation, Employment, and Productivity.

- Miller, J. (2015) Autonomous Vehicles: Implications for Employment Demand. The Bridge, 45(3), 5-11.
- National Center for O\*NET Development. (2010). Updating the O\*NET®-SOC Taxonomy: Incorporating the 2010 SOC Structure. Summary and Implementation. (https://www.onetcenter.org/dl\_files/Taxonomy2010\_Summary.pdf.)
- National Highway Traffic Safety Administration (2016). *Federal Automated Vehicles Policy: A Voluntary Approach to Accelerating the Next Revolution in Roadway Safety.* (https://icsw.nhtsa.gov/nhtsa/av/).
- SAE International (2014). "Automated Driving: Levels of Driving Automation are Defined in New SAE International Standard J3016. (<u>https://www.sae.org/misc/pdfs/automated\_driving.pdf</u>).

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## Appendices

### Appendix Table 1: Driving-related Jobs

	Occupation	2015 Employment	
SOC Code	Title	Level	Share
Motor Vehicle	Operators	3,796,110	100.0%
53-3032	Heavy and Tractor-Trailer Truck Drivers	1,678,280	44.2%
53-3033	Light Truck or Delivery Services Drivers	826,510	21.8%
53-3022	Bus Drivers, School or Special Client	505,230	13.3%
53-3031	Driver/Sales Workers	417,470	11.0%
53-3041	Taxi Drivers and Chauffeurs	180,750	4.8%
53-3021	Bus Drivers, Transit and Intercity	168,140	4.4%
53-3011	Ambulance Drivers and Attendants, Except Emergency Medical Technicians	19,730	0.5%
Other On-The-J	lob Drivers	11,665,680	100.0%
39-9021	Personal Care Aides	1,364,150	11.7%
33-9032	Security Guards	1,097,680	9.4%
33-3051	Police and Sheriff's Patrol Officers	653,740	5.6%
49-3023	Automotive Service Technicians and Mechanics	638,050	5.5%
47-2111	Electricians	592,240	5.1%
39-9011	Childcare Workers	573,430	4.9%
47-1011	First-Line Supervisors of Construction Trades and Extraction Workers	517,570	4.4%
49-1011	First-Line Supervisors of Mechanics, Installers, and Repairers	445,500	3.8%
33-3012	Correctional Officers and Jailers	427,740	3.7%
47-2152	Plumbers, Pipefitters, and Steamfitters	391,610	3.4%
11-9199	Managers, All Other	376,440	3.2%
33-2011	Firefighters	318,250	2.7%
43-5052	Postal Service Mail Carriers	315,940	2.7%
49-9021	Heating, Air Conditioning, and Refrigeration Mechanics and Installers	274,370	2.4%
13-1041	Compliance Officers	257,010	2.2%
29-2041	Emergency Medical Technicians and Paramedics	236,770	2.0%
41-9022	Real Estate Sales Agents	151,440	1.3%
53-6021	Parking Lot Attendants	144,130	1.2%
49-3021	Automotive Body and Related Repairers	143,030	1.2%
47-4051	Highway Maintenance Workers	140,650	1.2%
49-9051	Electrical Power-Line Installers and Repairers	115,220	1.0%
53-7081	Refuse and Recyclable Material Collectors	113,810	1.0%
53-6031	Automotive and Watercraft Service Attendants	109,390	0.9%
33-3021	Detectives and Criminal Investigators	106,580	0.9%
49-9052	Telecommunications Line Installers and Repairers	105,880	0.9%
49-2011	Computer, Automated Teller, and Office Machine Repairers	105,420	0.9%
33-1012	First-Line Supervisors of Police and Detectives	100,370	0.9%
47-4011	Construction and Building Inspectors	91,410	0.8%
19-2041	Environmental Scientists and Specialists, Including Health	87,090	0.7%
43-5021	Couriers and Messengers	73,170	0.6%
37-2021	Pest Control Workers	70,030	0.6%
49-2098	Security and Fire Alarm Systems Installers	64,600	0.6%

13-2021	Appraisers and Assessors of Real Estate	60,130	0.5%
33-1021	First-Line Supervisors of Fire Fighting and Prevention Workers	58,010	0.5%
47-3015	HelpersPipelayers, Plumbers, Pipefitters, and Steamfitters	55,280	0.5%
17-3031	Surveying and Mapping Technicians	50,650	0.4%
17-3027	Mechanical Engineering Technicians	48,800	0.4%
39-6011	Baggage Porters and Bellhops	44,120	0.4%
17-1022	Surveyors	43,080	0.4%
47-4041	Hazardous Materials Removal Workers	42,540	0.4%
33-1011	First-Line Supervisors of Correctional Officers	42,530	0.4%
49-9012	Control and Valve Installers and Repairers, Except Mechanical Door	42,490	0.4%
37-3013	Tree Trimmers and Pruners	39,420	0.3%
39-7011	Tour Guides and Escorts	35,770	0.3%
39-4021	Funeral Attendants	35,200	0.3%
43-5041	Meter Readers, Utilities	34,680	0.3%
19-4091	Environmental Science and Protection Technicians, Including Health	34,220	0.3%
49-9031	Home Appliance Repairers	33,180	0.3%
49-9091	Coin, Vending, and Amusement Machine Servicers and Repairers	32,020	0.3%
33-9021	Private Detectives and Investigators	30,440	0.3%
47-4099	Construction and Related Workers, All Other	29,870	0.3%
19-4093	Forest and Conservation Technicians	29,660	0.3%
47-4071	Septic Tank Servicers and Sewer Pipe Cleaners	26,910	0.2%
49-2097	Electronic Home Entertainment Equipment Installers and Repairers	26,780	0.2%
47-2131	Insulation Workers, Floor, Ceiling, and Wall	25,690	0.2%
53-6051	Transportation Inspectors	25,550	0.2%
39-4031	Morticians, Undertakers, and Funeral Directors	25,380	0.2%
47-2041	Carpet Installers	25,380	0.2%
37-3012	Pesticide Handlers, Sprayers, and Applicators, Vegetation	24,080	0.2%
49-2095	Electrical and Electronics Repairers, Powerhouse, Substation, and Relay	23,040	0.2%
47-5081	HelpersExtraction Workers	22,690	0.2%
47-2161	Plasterers and Stucco Masons	21,820	0.2%
19-1031	Conservation Scientists	20,130	0.2%
19-4011	Agricultural and Food Science Technicians	20,130	0.2%
47-4021	Elevator Installers and Repairers	19,680	0.2%
49-9011	Mechanical Door Repairers	17,830	0.2%
19-1023	Zoologists and Wildlife Biologists	17,750	0.2%
49-9094	Locksmiths and Safe Repairers	17,730	0.2%
17-3025	Environmental Engineering Technicians	17,310	0.1%
49-3022	Automotive Glass Installers and Repairers	17,080	0.1%
51-8092	Gas Plant Operators	16,670	0.1%
13-1032	Insurance Appraisers, Auto Damage	15,160	0.1%
49-2021	Radio, Cellular, and Tower Equipment Installers and Repairers	14,110	0.1%
19-4092	Forensic Science Technicians	13,910	0.1%
53-7072	Pump Operators, Except Wellhead Pumpers	13,290	0.1%
33-9011	Animal Control Workers	13,140	0.1%

### Appendix Table 1: Driving-related Jobs (cont.)

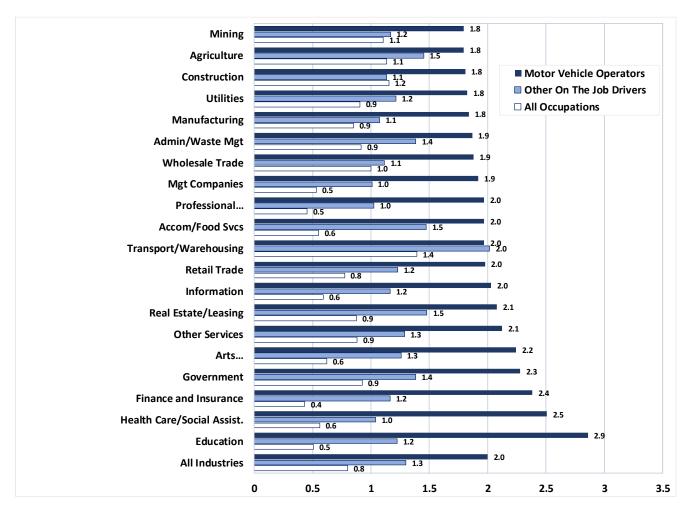
53-7073	Wellhead Pumpers	12,370	0.1%
33-2021	Fire Inspectors and Investigators	12,200	0.1%
51-8099	Plant and System Operators, All Other	11,390	0.1%
51-8012	Power Distributors and Dispatchers	11,350	0.1%
49-2096	Electronic Equipment Installers and Repairers, Motor Vehicles	10,290	0.1%
11-9161	Emergency Management Directors	9,570	0.1%
33-3041	Parking Enforcement Workers	8,650	0.1%
25-9021	Farm and Home Management Advisors	8,630	0.1%
19-1032	Foresters	8,510	0.1%
11-9061	Funeral Service Managers	8,270	0.1%
49-9063	Musical Instrument Repairers and Tuners	7,700	0.1%
45-4011	Forest and Conservation Workers	6,450	0.1%
53-6041	Traffic Technicians	6,360	0.1%
47-5031	Explosives Workers, Ordnance Handling Experts, and Blasters	5,930	0.1%
33-3031	Fish and Game Wardens	5,630	0.0%
53-7071	Gas Compressor and Gas Pumping Station Operators	3,950	0.0%
39-4011	Embalmers	3,670	0.0%
49-9081	Wind Turbine Service Technicians	3,470	0.0%
49-9092	Commercial Divers	3,110	0.0%
33-3052	Transit and Railroad Police	3,000	0.0%
45-4023	Log Graders and Scalers	2,560	0.0%
39-7012	Travel Guides	2,550	0.0%
33-2022	Forest Fire Inspectors and Prevention Specialists	1,590	0.0%
47-4091	Segmental Pavers	1,230	0.0%
13-1074	Farm Labor Contractors	1,210	0.0%

### Appendix Table 1: Driving-related Jobs (cont.)

Output Measure Name	Definition
1. Controlling Machines and Processes	Using either control mechanisms or direct physical activity to operate machines or processes (not including computers or vehicles)
2. Documenting/Recording Information	Entering, transcribing, recording, storing, or maintaining information in written or electronic/magnetic form
3. Drafting, Laying Out, and Specifying Technical Devices, Parts, and Equipment	Providing documentation, detailed instructions, drawings, or specifications to tell others about how devices, parts, equipment, or structures are to be fabricated, constructed, assembled, modified, maintained, or used
4. Handling and Moving Objects	Using hands and arms in handling, installing, positioning, and moving materials, and manipulating things
5. Interacting with Computers	Using computers and computer systems (including hardware and software) to program, write software, set up functions, enter data, or process information
6. Operating Vehicles, Mechanized Devices, or Equipment	Running, maneuvering, navigating, or driving vehicles or mechanized equipment, such as forklifts, passenger vehicles, aircraft, or water craft
7. Performing General Physical Activities	Performing physical activities that require considerable use of your arms and legs and moving your whole body, such as climbing, lifting, balancing, walking, stooping, and handling of materials
8. Repairing and Maintaining Electronic Equipment	Servicing, repairing, calibrating, regulating, fine-tuning, or testing machines, devices, and equipment that operate primarily on the basis of electrical or electronic (not mechanical) principles
9. Repairing and Maintaining Mechanical Equipment	Servicing, repairing, adjusting, and testing machines, devices, moving parts, and equipment that operate primarily on the basis of mechanical (not electronic) principles

### **Appendix Table 2: Definitions of O\*NET Output Measures**

Source: <u>https://www.O\*NETonline.org/find/descriptor/browse/Work\_Activities/4.A.3/</u>



#### Appendix Figure 1: Relative Importance of Driving by Industry

Source: O\*NET, see <a href="https://www.onetonline.org/">https://www.onetonline.org/</a>

### **Appendix Table 3: O\*NET Knowledge Categories**

- Business and Management Knowledge of principles and facts related to business administration and accounting, human and material resource management in organizations, sales and marketing, economics, and office information and organizing systems
  - Administration and Management Knowledge of business and management principles involved in strategic planning, resource allocation, human resources modeling, leadership technique, production methods, and coordination of people and resources.
  - Clerical Knowledge of administrative and clerical procedures and systems such as word processing, managing files and records, stenography and transcription, designing forms, and other office procedures and terminology.
  - Economics and Accounting Knowledge of economic and accounting principles and practices, the financial markets, banking and the analysis and reporting of financial data.
  - Sales and Marketing Knowledge of principles and methods for showing, promoting, and selling products or services. This includes marketing strategy and tactics, product demonstration, sales techniques, and sales control systems.
  - Customer and Personal Service Knowledge of principles and processes for providing customer and personal services. This includes customer needs assessment, meeting quality standards for services, and evaluation of customer satisfaction.
  - Personnel and Human Resources Knowledge of principles and procedures for personnel recruitment, selection, training, compensation and benefits, labor relations and negotiation, and personnel information systems.
- Manufacturing and Production Knowledge of principles and facts related to the production, processing, storage, and distribution of manufactured and agricultural goods
  - Production and Processing Knowledge of raw materials, production processes, quality control, costs, and other techniques for maximizing the effective manufacture and distribution of goods.
  - Food Production Knowledge of techniques and equipment for planting, growing, and harvesting food products (both plant and animal) for consumption, including storage/handling techniques.
- Engineering and Technology Knowledge of the design, development, and application of technology for specific purposes.
  - Computers and Electronics Knowledge of circuit boards, processors, chips, electronic equipment, and computer hardware and software, including applications and programming.
  - Engineering and Technology Knowledge of the practical application of engineering science and technology. This includes applying principles, techniques, procedures, and equipment to the design and production of various goods and services.
  - Design Knowledge of design techniques, tools, and principles involved in production of precision technical plans, blueprints, drawings, and models.
  - Building and Construction Knowledge of materials, methods, and the tools involved in the construction or repair of houses, buildings, or other structures such as highways and roads.
  - Mechanical Knowledge of machines and tools, including their designs, uses, repair, and maintenance.
- Mathematics and Science Knowledge of the history, theories, methods, and applications of the physical, biological, social, mathematical, and geography

### Appendix Table 3: O\*NET Knowledge Categories (cont.)

- Mathematics Knowledge of arithmetic, algebra, geometry, calculus, statistics, and their applications.
- Physics Knowledge and prediction of physical principles, laws, their interrelationships, and applications to understanding fluid, material, and atmospheric dynamics, and mechanical, electrical, atomic and sub- atomic structures and processes.
- Chemistry Knowledge of the chemical composition, structure, and properties of substances and of the chemical processes and transformations that they undergo. This includes uses of chemicals and their interactions, danger signs, production techniques, and disposal methods.
- Biology Knowledge of plant and animal organisms, their tissues, cells, functions, interdependencies, and interactions with each other and the environment.
- Psychology Knowledge of human behavior and performance; individual differences in ability, personality, and interests; learning and motivation; psychological research methods; and the assessment and treatment of behavioral and affective disorders.
- Sociology and Anthropology Knowledge of group behavior and dynamics, societal trends and influences, human migrations, ethnicity, cultures and their history and origins.
- Geography Knowledge of principles and methods for describing the features of land, sea, and air masses, including their physical characteristics, locations, interrelationships, and distribution of plant, animal, and human life.
- Health Services Knowledge of principles and facts regarding diagnosing, curing, and preventing disease, and improving and preserving physical and mental health and well-being
  - Medicine and Dentistry Knowledge of the information and techniques needed to diagnose and treat human injuries, diseases, and deformities. This includes symptoms, treatment alternatives, drug properties and interactions, and preventive health-care measures.
  - Therapy and Counseling Knowledge of principles, methods, and procedures for diagnosis, treatment, and rehabilitation of physical and mental dysfunctions, and for career counseling and guidance.
- Education and Training Knowledge of principles and methods for curriculum and training design, teaching and instruction for individuals and groups, and the measurement of training effects.
- Arts and Humanities Knowledge of facts and principles related to the branches of learning concerned with human thought, language, and the arts.
  - English Language Knowledge of the structure and content of the English language including the meaning and spelling of words, rules of composition, and grammar.
  - Foreign Language Knowledge of the structure and content of a foreign (non-English) language including the meaning and spelling of words, rules of composition and grammar, and pronunciation.
  - Fine Arts Knowledge of the theory and techniques required to compose, produce, and perform works of music, dance, visual arts, drama, and sculpture.
  - History and Archeology Knowledge of historical events and their causes, indicators, and effects on civilizations and cultures.

#### Appendix Table 3: O\*NET Knowledge Categories (cont.)

- Philosophy and Theology Knowledge of different philosophical systems and religions. This
  includes their basic principles, values, ethics, ways of thinking, customs, practices, and their
  impact on human culture.
- Law and Public Safety Knowledge of regulations and methods for maintaining people and property free from danger, injury, or damage; the rules of public conduct established and enforced by legislation, and the political process establishing such rules.
  - Public Safety and Security Knowledge of relevant equipment, policies, procedures, and strategies to promote effective local, state, or national security operations for the protection of people, data, property, and institutions.
  - Law and Government Knowledge of laws, legal codes, court procedures, precedents, government regulations, executive orders, agency rules, and the democratic political process.
- Communications Knowledge of the science and art of delivering information
  - Telecommunications Knowledge of transmission, broadcasting, switching, control, and operation of telecommunications systems.
  - Communications and Media Knowledge of media production, communication, and dissemination techniques and methods. This includes alternative ways to inform and entertain via written, oral, and visual media.
- Transportation Knowledge of principles and methods for moving people or goods by air, rail, sea, or road, including the relative costs and benefits.

### Appendix Table 4: O\*NET Cross-Functional Skill Categories

- Social Skills Developed capacities used to work with people to achieve goals
  - $\circ~$  Social Perceptiveness Being aware of others' reactions and understanding why they react as they do.
  - Coordination Adjusting actions in relation to others' actions.
  - $\circ~$  Persuasion Persuading others to change their minds or behavior.
  - Negotiation Bringing others together and trying to reconcile differences.
  - $\circ~$  Instructing Teaching others how to do something.
  - Service Orientation Actively looking for ways to help people.
- Complex Problem Solving Skills Developed capacities used to solve novel, ill-defined problems in complex, real-world settings
  - Complex Problem Solving Identifying complex problems and reviewing related information to develop and evaluate options and implement solutions.
- Technical Skills Developed capacities used to design, set-up, operate, and correct malfunctions involving application of machines or technological systems
  - o Operations Analysis Analyzing needs and product requirements to create a design.
  - Technology Design Generating or adapting equipment and technology to serve user needs.
  - Equipment Selection Determining the kind of tools and equipment needed to do a job.
  - o Installation Installing equipment, machines, wiring, or programs to meet specifications.
  - Programming Writing computer programs for various purposes.
  - Operation Monitoring Watching gauges, dials, or other indicators to make sure a machine is working properly.
  - Operation and Control Controlling operations of equipment or systems.
  - Equipment Maintenance Performing routine maintenance on equipment and determining when and what kind of maintenance is needed.
  - Troubleshooting Determining causes of operating errors and deciding what to do about it.
  - Repairing Repairing machines or systems using the needed tools.
  - Quality Control Analysis Conducting tests and inspections of products, services, or processes to evaluate quality or performance.
- Systems Skills Developed capacities used to understand, monitor, and improve socio-technical systems
  - Judgment and Decision Making Considering the relative costs and benefits of potential actions to choose the most appropriate one.
  - Systems Analysis Determining how a system should work and how changes in conditions, operations, and the environment will affect outcomes.
  - Systems Evaluation Identifying measures or indicators of system performance and the actions needed to improve or correct performance, relative to the goals of the system.
- Resource Management Skills Developed capacities used to allocate resources efficiently
  - Time Management Managing one's own time and the time of others.
  - Management of Financial Resources Determining how money will be spent to get the work done, and accounting for these expenditures.
  - Management of Material Resources Obtaining and seeing to the appropriate use of equipment, facilities, and materials needed to do certain work.
  - Management of Personnel Resources Motivating, developing, and directing people as they work, identifying the best people for the job.

	Bus Drivers	Driver/Sales Workers and Truck Drivers		All Motor Vehicle Operators
A. Occupational Employment Stati	istics, 2015			
Employment (thousands of workers)	674	2,922	181	3,777
Employment Share (%)	17.8	77.4	4.8	100
Mean Annual Wages (dollars)	32,980	38,030	26,070	36,460
B. American Community Survey, 2	015 Public Use	e Microdata Sa	mple	
Median Age (years)	53	46	48	47
Educational Attainment (%)				
Less than HS	8.3	16.1	13.9	14.8
HS or GED	43.1	47.3	36.0	45.6
Some College	39.4	30.5	32.8	32.0
Bachelors Plus	9.2	6.1	17.3	7.6
Unemployment Rate (%)	3.7	4.9	4.8	4.7
Male (%)	54.4	94.1	86.1	88.0
Race (%)				
White	63.3	74.0	50.9	70.3
Black	27.3	15.0	25.1	17.6
Other	9.4	11.0	24.0	12.3
Hispanic (%)	13.7	19.5	18.5	18.7
Married, spouse present (%)	53.3	54.5	49.4	53.8
Non-Citizen (%)	3.2	8.1	17.8	8.4
Self-Employed (%)	1.4	10.7	32.2	11.
Poverty (%)	6.4	5.5	12.7	6.3
Veteran (%)	11.5	11.7	9.3	11.
No Health Insurance Coverage (%)	8.1	15.6	21.6	15.2
No Home Internet Access (%)	15.3	14.6	14.8	14.7
No Home Computer (%)	9.3	9.0	9.8	9.2
C. Annual Social and Economic Sup	plement to Cu	rrent Populati	on Survey , 2	016
Worked part-time last year (%)	39.0	11.6	30.8	17.2
Paid by the hour (%)	73.5	67.2	40.2	64.7
Included in pension plan at work (%)	35.9	24.5	11.2	24.3
Union coverage (%)	31.8	15.7	16.2	17.4
U			6.2	

### Appendix Table 5: Demographic and Economic Characteristics of Motor Vehicle Operators

Ambulance Drivers and Attendants, Except for EMTs are not shown separately because of insufficient data. Percentages for Educational Attainment and Race may not sum to 100.0% due to rounding.

	Employment (thousands)	Employment (share)	Mean Annual Wages	Mean Hourly Wages
Bus Drivers	673,370	100.0%	32,980	\$15.85
Bus Drivers, Transit and Intercity	168,140	25.0%	40,160	19.31
Bus Drivers, School or Special Client	505,230	75.0%	30,580	14.70
Driver/Sales Workers and Truck Drivers	2,922,260	100.0%	38,030	\$18.28
Driver/Sales Workers	417,470	14.3%	27,890	13.41
Heavy and Tractor-Trailer Truck Drivers	1,678,280	57.4%	42,500	20.43
Light Truck or Delivery Services Drivers	826,510	28.3%	34,080	16.38

Appendix Table 6: Detailed Employment and Wages Data for Bus Drivers and Driver/Sales Workers and Truck Drivers

Source: Occupational Employment Statistics 2015

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U.S. Department of Commerce Economics and Statistics Administration Office of the Chief Economist Room 4848 1401 Constitution Ave., NW Washington, DC 20230 esa.doc.gov

Technical inquiries: Office of the Chief Economist (202) 482-3523

Media inquiries: Office of Communications (202) 482-3331





