# D|FFERENT SKILLS, DIFFERENT GAPS MEASURING \& CLOSING THE SKILLS GAP 

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## EXECUTVE SUMMARY

## DIFFERENT SKILLS, DIFFERENT GAPS

## DIFFERENT

 SKLLLS, DIFFERENT GAPSThe U.S. labor market is as tight as it has been since the Great Recession, with unemployment at $4.1 \%$ in December 2017. ${ }^{1}$ Yet employers continue to struggle to find the skilled labor they need. If job creation in the aggregate isn't solving the problem, how can we identify and address the specific places where supply isn't meeting demand?

In Different Skills, Different Gaps: Measuring and Closing the Skills Gap, prepared for the U.S. Chamber of Commerce Foundation, we examine the skills gap on an occupation-byoccupation basis. This is the best way to both understand the gap, and to close it. An overall surplus of workers doesn't offer much insight into the challenges of a specific industry looking to fill specific roles requiring specific skills.

In the aggregate, across all the occupations studied, we found there were $5 \%$ more job openings than workers. But in 12 specific career areas, we found that demand for workers exceeded available supply, adding up to a total skills gap of 4.4 million openings. The categories with the largest shortages include:

- Health Care: 1,153,617 openings
- Business and Financial Operations: 985,214 openings
- Office and Administrative Support: 461,263 openings
- Sales: 388,857 openings
- Computers and Mathematics: 356,527 openings

[^0]Different industries are suffering skills gaps for different reasons including too few workers in the training pipeline or changing role requirements that lead to misalignment. Some fields, such as health care practitioners, computer and information scientists, and information security analysts suffer from a shortage of workers and long lead times in training new ones. In other areas of the job market, such as office and administrative jobs, hiring and training systems seem to be misaligned as employers raise the bar for hiring. High- and middle-skill occupations tend to have shortages, while low-skill occupations have a surplus of workers.

The solutions to the gap, therefore, need to be tailored to specific industries. Key implications include:

1. A need for improved alignment between education and workforce systems and a rapidly changing labor market. Well-aligned programs are closely linked to labor market demand and deliver good outcomes in terms of jobs and wages for graduates.
2. A need for an expanded employer leadership role in those systems. Employers must not serve merely as advisors, but also play a more significant role as customers of the education and training systems to ensure their demand for a skilled and competitive workforce is met.
3. A need for improved employer signaling, particularly around the changing competency and credentialing requirements for the fastest growing and hardest to fill jobs. In a rapidly evolving job market clear and effective signaling is critical for training providers to assess and address the specific skill needs of employers.

A crucial lesson of this research is that the skills gap is not singular; it is cumulative-the result of different gaps across different kinds of occupations. That is part of why addressing the skills gap has proven so elusive: it defies easy categorization.


## INTRODUCTION

The term "skills gap" conjures up the image of one giant chasm, a sort of Grand Canyon between what employers need and what workers can provide. But that suggests that the skills gap is a single problem with a single cause and a single solution. In fact, the gaps around specific skills vary in their characteristics and, as a result, affect different corners of the job market in very different ways. Rather than one canyon, the gap is much more akin to a series of potholes, damaging some industries and avoided by others.

In this report for the U.S. Chamber of Commerce Foundation, Burning Glass Technologies approached the problem using an innovative new model to map both supply (using federal workforce statistics) and demand (based on job postings). With this approach, we are able to assess the worker shortfall at an occupational level, role by role. This provides a picture of which roles, industry by industry, have robust talent supply chains and which face gaps. A rolebased approach to understanding the skill gap is important as it allows training providers and policy makers to direct resources into developing the specific skills industries need to build a successful workforce.

Our report finds a lack of alignment between the skills employers need and the available talent in the workforce. In 12 of the career areas we studied, we found that demand for workers exceeded available supply by a total of 4.4 million openings. These job categories and associated shortages include:

- Health Care: 1,153,617
- Business and Financial Operations: 985,214
- Office and Administrative Support: 461,263
- Sales: 388,857
- Computers and Mathematics: 356,527

In our research, we found that these different industries are suffering skills gaps for different reasons. In some fields, such as health care, the challenge seems to be a straightforward problem of demand exceeding supply. In other areas of the job market, hiring and training systems seem to be misaligned with what employers demand.

Another area of interest was a comparison to trends during and after the Great Recession. In 2016, there were $5 \%$ more openings than available workers, compared to 2012, in the midst of the recession, when there were $5 \%$ more available workers than openings. When looking at more detailed trends over the course of recovery from the recession, we find that many skilled occupations such as computer roles, engineers, and health care professionals had skill gaps consistently throughout this period. Middle skill occupations such as administrative roles and maintenance/repair roles had a surplus of workers during the period of high unemployment, but now face shortages in the number of available workers relative to openings.

This paper concludes with recommendations for how to improve education and workforce system alignment, employer leadership, and employer signaling.

## PARTI: A NEW VIEW OF THESKIILS GAP

There are many who still challenge the existence of a skills gap. Surveys of employers routinely find that companies have difficulty finding skilled workers. ${ }^{2}$ Some economists argue that, if that were true, wages would be rising and employers would be investing more in training. ${ }^{3}$

In our research, we developed a supply/demand model that compares the number of open positions to the number of available workers in the field for each occupation. In this way, we can see which roles have skill gaps-demand exceeds supply, which are in equilibrium—demand matches supply, and which have a surplus of available talent-supply exceeds demand.

To measure demand, we use an econometric model which starts with total postings collected by Burning Glass by occupation, and normalizes those to equal the total number of national openings reported by the Bureau of Labor Statistics' Job Openings and Labor Turnover Survey (JOLTS). Supply is measured based on the total number of workers separating from their job in JOLTS. We then estimate a turnover rate for each occupation based on data from the Census's Current Population Survey (CPS). We determine the available number of workers by multiplying the churn rate by the total employment in each industry and occupation. Demand and supply are then compared to determine the ratio used as a summary statistic for each occupation.

With this approach, we can identify whether the supply of currently employed workers is greater, less, or roughly equal to the number of job openings posted, which sheds light on whether there is a skills gap for a particular occupation, and what the nature of the gap might be.

Of course, having more openings than workers is not always a negative, and can yield certain advantages. Workers are able to change jobs and advance in their careers, unemployed workers

## "Surveys of employers routinely find that companies have difficulty finding skilled workers."

[^1]CHART 1: DEMAND/SUPPLY RATIO BY OCCUPATION

can be rehired relatively quickly, and it is an indication that the economy is growing. Too many openings in relation to available labor supply, however, is a sign that employers are having trouble filling positions, and that the pipeline for workers is falling behind demand.

Our research shows that roles requiring highly skilled workers - such as health care practitioners, business and financial operations, computer and mathematics professionals, and architecture and engineering roles - are the most undersupplied roles. In each case, there are at least 15\% more openings than available workers in the market. For health care practitioners, the gap is even more severe, with 44\% more openings than available workers.

At the other end of the spectrum, the occupation groups with the largest supply of workers include Construction and Extraction, Arts and Design, and Food Preparation. Each of these have at least 13\% fewer openings than available workers.

From an education and training perspective, high-skill occupations, defined as those where at least $80 \%$ of online job postings for that position request a bachelor's degree or higher, have 25\% more openings than available workers. Middle-skill occupations, such as welders, administrative assistants, and computer support specialists, have $13 \%$ more openings than workers. ${ }^{4}$ Low-skill occupations have the opposite problem: $7 \%$ fewer openings than available workers.

[^2]
## PART 2: <br> EVOLUTION OF THE SKILISGAP

The skills gap is neither new nor static. In some cases, gaps exist but are closing, which is good news for employers. In others, the gap is widening. To measure these gaps, we constructed a skills gap model by occupation family, a group of related roles, for each of the last five years, 2012 through 2016.

Not surprisingly, the number of openings per worker has increased as the economy has improved. In fact, the ratio of supply and demand has flipped. In 2012, there were 5\% fewer openings than available workers, whereas our model finds that in 2016 there were $5 \%$ more openings that workers. In nearly every occupational family, we have seen the market tightening, with an increase in the ratio between demand and supply.

The two occupation families where the demand/supply ratio has decreased are Computer and Mathematics and Architecture and Engineering, which each had sizeable gaps both during and following the recession, declining slightly over the course of the recovery. This is largely a function of supply starting to catch up with demand. Supply in Computer and Mathematics roles has risen $33 \%$ over the period, while demand has increased by 25\%. For Architecture and Engineering roles, supply has risen by $22 \%$ compared to a $17 \%$ increase in demand.

How individual firms and industries have fared depends significantly on what kinds of occupations comprise their hiring. To understand better differences in impact of supply and demand dynamics, we will examine the trend in the supply/demand ratios for groups of similar occupation families:

- A cross-cutting set of business occupations hired by nearly every type of firm;
- Engineering and manufacturing roles; and
- Health care roles.


## CROSS-CUTTING BUSINESS OCCUPATIONS

Four occupation families represent business-critical functions in nearly all companies-Business and Financial Operations, Sales and Related, Office and Administrative Support, and Computer and Mathematics. In these families, we find that the supply/demand dynamics form two clusters:

- Specialized roles with large gaps that have held steady over time; and
- More general roles, which have seen markets tighten during the recovery.

The specialized role cluster includes Business and Financial Operations and Computer and Mathematics (i.e. Information Technology). These two occupation families have the second- and third-largest gaps between available supply and demand on a percentage basis. In addition, their
demand/supply ratio hasn't shifted during the recovery. The ratio for Computer and Mathematics roles was down slightly during the recovery, and the others have been flat.

This is likely in part because these, and other highly skilled roles, were less affected by the downturn and so the dynamics of employers looking for additional skilled labor have remained fairly steady. While demand has increased, available supply has increased as well.

Employers have seen the market for Office and Administrative Support workers and Sales workers tighten as the economy has improved. In 2012, each of these occupation groups was oversupplied, with roughly $5 \%$ fewer openings than workers. In 2016, each group had $5 \%$ more openings than workers. These roles show a tightening market for employers seeking middleskill workers.

CHART 4: DEMAND AND SUPPLY OF BUSINESS OCCUPATIONS OVER TIME


## "The number of openings per worker has increased as the economy has improved. In fact, the ratio of supply and demand has flipped."

## ENGINEERING AND MANUFACTURING OCCUPATIONS

In engineering, manufacturing and other skilled trade occupations, we see that occupations requiring more advanced training have gaps that have endured the recession, while markets for middle-skill jobs have tightened. Engineers show $15 \%$ more openings than available workers. As with information technology workers, that gap has slightly declined since 2012 (by 4\%).

Installation and Repair workers have seen a notable shift. In 2012, there was a $14 \%$ surplus of openings in this field, which has been absorbed and become a $2 \%$ opening shortage.

Though our data suggests otherwise, manufacturing employers consistently cite a deep shortage of production workers with the skills and qualifications they need. ${ }^{5}$ A likely explanation for the discrepancy between our model, which shows a modest shortage, and the experience of employers is that the skills requirements in the industry are changing, making many available workers underqualified for currently available jobs. This indicates a genuine skills gap, a misalignment between the skills possessed by workers and the skills needed by employers.

[^3]

CHART 5: DEMAND AND SUPPLY OF ENGINEERING, MANUFACTURING OVER TIME

> "Occupations requiring more advanced training have gaps that have endured the recession, while markets for middle-skill jobs have tightened."

## HEALTH CARE OCCUPATIONS

Health care occupations show large and growing gaps between employer needs and available workers. The Bureau of Labor Statistics divides the Health Care category into practitioner roles (such as doctors, nurses, and technicians) and support professionals (such as medical assistants and home health aides). In both cases, we see skills gaps where employers do not have enough available workers to address their needs. This is particularly true among higher-skill practitioner roles where openings exceed available workers by more than $40 \%$. This is by far the most dramatically expanding skills gap in our research.

CHART 6: DEMAND AND SUPPLY OF HEALTH CARE OCCUPATIONS OVER TIME


## "The most dramatically expanding skills gap in our research is in health care occupations."

There are several possible causes of the skills gaps that we see across different occupations:

- Supply Shortage: There are not enough workers with the appropriate background to fill positions in a given field or occupation.
- Misalignment of Hiring and Training Systems: Employers may not have configured their hiring and training systems in a way that acquires and develops the talent they need.


## SUPPLY SHORTAGES

A skills gap usually presumes a lack of higher-order skills. Shortages of workers, however, can strike high, middle, or low-skill occupations. The reasons for those shortages may be quite different. In high-skill occupations, a skills gap can be caused by training programs that don't produce enough qualified workers. Essentially, this is a problem with the supply pipeline, and would need to be addressed by training programs.

In low- and middle-skill occupations, by contrast, a worker shortage may be caused by a lack of workers willing to choose these roles. Workers commonly cite reasons such as relatively low pay and benefits.

## Occupations facing supply shortages include:

## Health Care Practitioners

This is one of the most severe shortages we identified, with nearly 1.5 openings for every available worker across this occupational family. Importantly, the shortages are particularly high among rapidly growing, advanced practice clinical care roles, such as nurse practitioners, physician's assistants, physical therapists, and occupational therapists. Each of these roles has more than 1.7 openings for every potential worker.

Put another way, the 1.5 ratio means there are 1.04 million health care jobs going unfilled because of a lack of qualified workers. In the fields with the highest ratios of openings to workers, that means the field is short by more than 52,000 physical therapists, more than 43,000 nurse practitioners, 24,000 occupational therapists, and 23,000 physician assistants.

Also troubling is the fact that clinical health care roles require long training periodsoften graduate study-and that demand is projected to increase. The Bureau of Labor Statistics projects that need for nurse practitioners, physician's assistants, and physical

[^4]therapists is projected to grow by at least $25 \%$ over the next 10 years. ${ }^{6}$ Growth in these fields is projected to rise three to five times faster than the job market overall, placing these occupations in the top $3 \%$ of all jobs in terms of projected growth.

Licensure requirements for workers, accreditation rules, and new program approval processes for training providers impact the rate at which universities are able to expand programs for advanced health care roles.



[^5]
## Computer and Information Scientist

As recently as 2012, computer scientists showed no gap at all as an occupation, but now we see a gap of 1.2 openings for every worker. That's the largest change of any technology occupation over time.

The reason for the shift is the explosion in big data analysis and the growing demand for data scientists (which the Bureau of Labor Statistics includes under the Computer Scientist occupation).

In 2012, there were just 1,061 postings for Data Scientists. By 2016, that number grew 14 -fold, to 14,653 . The supply of data scientists hasn't been able to keep up. In other research, we identified data analytics as a "disruptive skill" that shakes up job markets because of its crucial nature to business success, sourcing challenges, and the lack of an established training system.?

## Hybrid Occupations, Including Information Security Analysts

Security breaches have left business sectors from retail to finance scrambling for cybersecurity talent over the last few years. ${ }^{8}$ The ratio between openings and workers is 1.5, comparable to the health care industry gap. Also like health care, more specialized roles within the industry have larger gaps.

Interestingly, the skills gap for an information security analyst is much more severe than for a network administrator (1.1 openings/worker), even though the latter requires many similar skills. Employers who are able to train network administrators with cybersecurity skills can take advantage of the overlap between the two roles and address talent shortages more easily.

One additional factor in the information security field is the growth of "hybrid jobs," roles that blend skills from different domains. ${ }^{9}$ Information security roles often blend skills from a range of disciplines including information technology, risk management, business, and business analysis. Training designed for a hybrid job may be hard to come by because, by their very nature, hybrid jobs don't tend to align with existing training programs-computer science programs don't teach business skills, and vice versa.

For example, operations research analysts need both information technology skills and business analysis skills. Because of this overlap requiring multiple training paths, the skills gap for this role is larger ( 1.5 workers/job) than for the similar roles which blend to create the position: computer systems analysts have a ratio of 1.2 workers per job, and management analysts a ratio of 1.3 workers/job.

## Customer Service Representatives, Personal Care Aides, Truck Drivers

A supply shortage also exists for many important and growing low- and middle-skill occupations. Truck drivers, personal care aides, and customer service representatives all have high ratios of openings to available workers.

There are certainly opportunities in these fields. Demand for both personal care aides and customer service representatives is projected to grow rapidly over the next 10 years ( $24 \%$ and $10 \%$, respectively). The problem is that these jobs aren't that attractive, with relatively low pay and often challenging working conditions.

[^6]
## MISALIGNED HIRING AND TRAINING

Hiring is still more art than science, and as a result many employers miss the mark in terms of finding the employees and skills they need. Often, employers have difficulty articulating their needs to training providers, with the consequent risk that the program will not properly prepare workers.

## Occupations in this category include:

## Office and Administrative Support

One example is in office and administrative support roles, which have gone from having too many workers per opening to too few over the last five years. The ratio has swung from 0.95 openings per worker in 2012 to 1.05 in 2016. Or, put another way, in 2012 there were 375,933 more Office and Administrative Support workers than there were posted openings, compared to 427,736 more openings than workers in 2016.

Partly this is because of the Great Recession and its impact on hiring. Another factor, however, is that employers have been raising the bar for these roles. Formerly middleskill positions, these roles now require a bachelor's degree. In some cases this is driven by increasing skills requirements for a role, whereas in others it may be that hiring managers are raising standards to bring on more credentialed candidates during a slack labor market.

In addition, employers may also be using the bachelor's degree as a proxy for soft skills. These skills-communication, collaboration, time management, and so on-are crucial in administrative roles, and employers often complain about how difficult they are to find among high school graduates.

By requiring a bachelor's degree, the available talent pool for these roles decreases. For example, $37 \%$ of job postings for bookkeepers ask for a bachelor's degree, compared to $19 \%$ of current bookkeepers who have one. In our analysis, there are 1.05 openings per worker, or 29,748 unfilled openings. For human resources assistants, there's an 8\% gap (37\%/29\%) and an imbalance of 1.12 workers per opening, or 6,629 unfilled openings. Research also suggests that increasing credential requirements for hiring are a "sticky" decision: once raised, the bar tends to stay raised. ${ }^{10}$

## Management

Overall, management roles have larger skills gaps than those of the people they manage. Management and supervisory roles have 1.3 openings per worker versus 1.02 for all roles. This is true across nearly all occupation families, with the exceptions of Information Technology and Transportation. Information technology workers, for example, are often highly specialized, so technical skills gaps are more likely to be a problem than skills gaps for cross-cutting management experience. By contrast, as noted above, there are supply shortages for truck drivers because of the nature of the work.

In making this calculation, we assume that employers want to hire managers with prior experience in the field. While there are particular skills unique to management, managers are not infinitely transferrable. You cannot turn an information technology manager into a nursing supervisor.

[^7]
## PART 4: RECOMMENDATIONS

This analysis highlights skills shortages facing employers amidst a tightening labor market. These gaps are especially pronounced in many business-critical and high-skill roles.

But addressing skills gaps at a national scale is neither a small, nor simple problem. Resolving skills gaps requires systemic effort from three primary actors in the workforce system: training providers, employers, and policy makers

## IMPROVED ACCESS TO AND OUTCOMES FROM POST-SECONDARY EDUCATION AND TRAINING PROVIDERS

The data included in this report help to reinforce the case that there is a need for improved access to postsecondary education, training, and credentialing opportunities. We do not suggest that everyone needs a four-year degree, but it is clear that the most in-demand jobs require some form of postsecondary education or training. In occupations which typically require a bachelor's degree, there are $25 \%$ more openings than available workers. In our new economy, fewer jobs providing family-sustaining wages will be going to those with a high school diploma or less, and employers are expressing the need for more high skilled workers today.

We need better alignment between the changing workforce needs of the economy and our education and workforce systems. There are opportunities to build and reinforce alignment in the higher education and K-12 systems with the reauthorization of the Higher Education Act and the Carl D. Perkins Career and Technical Education Act. Alignment should include a focus on supporting those programs that are closely linked to labor market demand as well as programs that deliver good outcomes in terms of jobs and wages.

> "The most in-demand jobs require some form of postsecondary education or training."

## INCREASED CONNECTION BETWEEN EMPLOYERS AND HIGHER EDUCATION

Employers too will need to play an expanded leadership role in education and workforce training systems to ensure alignment between what people learn and the career opportunities available in the new economy. This means that employers must not serve merely as advisors, but must play a more significant role as customers of the education and training systems to ensure their demand for a skilled and competitive workforce is met.

For example, this report finds that employers struggle to hire workers with the requisite management skills. This problem will get worse in the coming years as the baby boom generation retires. Management skills are often best developed through a combination of on-the-job training, which employers can best provide, along with more structured training through formal providers in higher education. Indeed, employers are in the best position to identify potential managers who can benefit from formal training. Deepening the connection between employers and higher education will allow both employers and higher education to play to their strengths in building a talent supply chain for managers.

The U.S. Chamber of Commerce Foundation's (USCCF) Talent Pipeline Management (TPM) initiative is an example of how employers are changing the way they partner with education and training providers to close the skills gap for their most critical positions. ${ }^{11}$ As part of the TPM strategy, employers play an expanded leadership role as "end-customers" of flexible and responsive talent supply chain partnerships with preferred education and training providers.

Through the newly launched TPM Academy, USCCF is training business associations and employers on how to implement performance-based, talent supply chain solutions in communities across America.

## IMPROVED SIGNALING BY EMPLOYERS ABOUT LABOR MARKET NEEDS

If supply is going to keep up with demand in a rapidly changing labor market, employers need to more effectively signal the competencies, skills, and credentialing requirements for their most critical positions. In this economy, job descriptions will continue to undergo change, and the change will be more frequent, requiring clearer and more granular signals about employer hiring requirements that connect to their talent acquisition and hiring process.

As the job market changes and skill requirements evolve, employers can play a proactive role in signaling their needs to workers and the training providers who support them. For example, this report highlights skill gaps in hybrid jobs, roles which combine disparate skills and for which few degree programs exist. Employers are likely to see hybrid trends emerging before other stakeholders, and are best positioned to flag these needs. Data scientists and cybersecurity analysts are two examples of hybrid roles highlighted in this report. As the workforce continues to evolve and specialize, the need for strong signaling about emerging jobs and skills becomes ever more critical.

More than an employer engagement challenge, better employer signaling around changing job needs will require a technology solution. USCCF is organizing a pilot demonstration of a new job

[^8]
registry service that will help employers send faster, clearer, more dynamic signals about their changing job requirements. ${ }^{12}$ This will be done through leveraging advances made in linked data and open human resource data standards for describing competencies, skills, and credentialing requirements. With employers providing structured, linked data around their hiring needs, education and training systems will have more granular, real-time, and actionable data to align their curriculum and credentials to improve workforce transitions.

With 4.4 million jobs unfilled because of unavailable talent, even as workforce participation remains stubbornly low, the skills gap is increasingly costly for employers and workers alike. Yet a crucial lesson of this research is that the skills gap is not singular; it is cumulative-the result of different gaps across different kinds of occupations. That is part of why addressing the skills gap has proven so elusive: it defies easy categorization. As we have shown, these mismatches affect different corners of the market in different ways based on a range of root causes. By charting the landscape of supply-demand imbalances more comprehensively, we hope that this report will contribute to efforts to build a more effective labor market, highlighting both where and how solutions can be deployed.

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[^9]
## APPENDIX:

## TABLE 1: DEMAND AND SUPPLY RATIO AND SURPLUS JOB OPENINGS BY OCCUPATION

| Occupation Family | Demand/ <br> Supply Ratio | Surplus Job Openings |
| :--- | :---: | :---: |
| Health Care Practitioners | 1.44 | $1,153,617$ |
| Business and Financial Operations | 1.17 | 985,214 |
| Computer and Mathematics | 1.15 | 356,527 |
| Architecture and Engineering | 1.13 | 151,976 |
| Transportation and Material Moving | 1.09 | 558,339 |
| Health Care Support | 1.09 | 133,217 |
| Building and Grounds Cleaning and Maintenance | 1.05 | 176,978 |
| Sales | 1.05 | 388,857 |
| Farming, Fishing, and Forestry | 1.05 | 3,541 |
| Office and Administrative Support | 1.05 | 461,263 |
| Life, Physical, and Social Science | 1.02 | 22,229 |
| Installation, Maintenance, and Repair | 1.00 | 34,063 |
| Personal Care | 0.97 | $-1,249$ |
| Production | 0.87 | $-108,282$ |
| Food Preparation and Service | 0.83 | $-1,238,927$ |
| Arts, Design, Entertainment, Sports, and Media | $-181,036$ |  |
| Construction and Extraction | 0.80 | $-630,576$ |

## "The skills gap is not singular; it is cumulative-the result of different gaps across different kinds of occupations."

## TABLE 2: DEMAND/SUPPLY RATIO BY OCCUPATION FAMILY AND YEAR

| Occupation Family | Demand/Supply Ratio |  |  |  |  |
| :--- | :---: | :---: | :---: | :---: | :---: |
|  | $\mathbf{2 0 1 2}$ | $\mathbf{2 0 1 3}$ | $\mathbf{2 0 1 4}$ | $\mathbf{2 0 1 5}$ | $\mathbf{2 0 1 6}$ |
| Health Care Practitioners | 1.23 | 1.19 | 1.27 | 1.42 | 1.44 |
| Business and Financial Operations | 1.19 | 1.18 | 1.20 | 1.23 | 1.21 |
| Computer and Mathematics | 1.25 | 1.21 | 1.21 | 1.21 | 1.17 |
| Architecture and Engineering | 1.19 | 1.13 | 1.16 | 1.19 | 1.15 |
| Transportation and Material Moving | 0.98 | 1.02 | 1.09 | 1.12 | 1.13 |
| Health Care Support | 1.04 | 0.97 | 1.06 | 1.10 | 1.09 |
| Building and Grounds Cleaning and Maintenance | 0.97 | 0.97 | 1.07 | 1.10 | 1.09 |
| Sales | 0.95 | 1.00 | 0.97 | 0.99 | 1.05 |
| Farming, Fishing, and Forestry | 1.07 | 1.08 | 1.11 | 1.02 | 1.05 |
| Office and Administrative Support | 0.96 | 0.97 | 1.01 | 1.04 | 1.05 |
| Life, Physical, and Social Science | 0.98 | 0.94 | 1.03 | 1.01 | 1.05 |
| Installation, Maintenance, and Repair | 0.86 | 0.91 | 0.95 | 0.97 | 1.02 |
| Personal Care | 0.93 | 0.94 | 0.97 | 0.94 | 1.00 |
| Production | 0.93 | 0.92 | 0.97 | 0.94 | 0.97 |
| Food Preparation and Service | 0.79 | 0.82 | 0.89 | 0.89 | 0.87 |
| Arts, Design, Entertainment, Sports, and Media | 0.79 | 0.81 | 0.83 | 0.84 | 0.83 |
| Construction and Extraction | 0.54 | 0.66 | 0.74 | 0.73 | 0.80 |
| Overall Job Market | 0.95 | 0.97 | 1.01 | 1.03 | 1.05 |

## "Mismatches affect different corners of the market in different ways based on a range of root causes."

## ABOUT BURNING GLASS TECHNOLOGIES

Burning Glass Technologies delivers job market analytics that empower employers, workers, and educators to make data-driven decisions. The company's artificial intelligence technology analyzes hundreds of millions of job postings and real-life career transitions to provide insight into labor market patterns. This real-time strategic intelligence offers crucial insights, such as which jobs are most in demand, the specific skills employers need, and the career directions that offer the highest potential for workers. For more information, visit BurningGlass.com.

## ABOUT THE U.S. CHAMBER OF COMMERCE FOUNDATION

The U.S. Chamber of Commerce Foundation is dedicated to strengthening America's longterm competitiveness. We educate the public on the conditions necessary for business and communities to thrive, how business positively impacts communities, and emerging issues and creative solutions that will shape the future..

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[^0]:    1. Bureau of Labor Statistics. "Employment Situation - December 2017." January 2018. https://www.bls. gov/news.release/archives/empsit_01052018.htm
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[^2]:    4 We define middle-skill roles here as those positions where the median wage is greater than $\$ 15.00$, a living wage based on MIT's living wage calculator and where at least $20 \%$ of positions are available to job seekers with a sub-baccalaureate credential. Low skills occupations are defined that those which pay less than $\$ 15.00$ per hour and high skill occupations are defined as those where at least $80 \%$ of job postings specifically request a bachelor's degree qualification.

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[^8]:    11 To learn more about the TPM movement visit www.TheTalentSupplyChain.org.

[^9]:    12 To learn more about the Clearer Signals project visit https://www.uschamberfoundation.org/blog/post/ reinventing-employer-signaling-rapidly-changing-talent-marketplace.

