# Who Invents IT? 

## WOMEN'S PARTICIPATION IN

INFORMATION TECHNOLOGY PATENTING

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## Introduction

In 2007 and 2012, the National Center for Women \& Information Technology, in partnership with 1790 Analytics, published prior reports on gendered patterns in IT patenting, analyzing records from the U.S. Patent and Trademark Office. The original report examined women's patenting rates in IT and how these rates evolved over the prior 25 years. It also identified how these rates differ across IT industry sub-categories and across specific organizations. This new edition updates those findings, examining U.S. patent data from 1980-2020. It updates the following questions from the earlier report:

- What are the overall rates of IT patenting for men, women, and mixed-gender collaborations?
- How have these rates changed during the past five years and how does this compare to the findings from the previous report?
- How do patenting rates differ across IT industry subcategories? (e.g. Communications and Telecommunications, Computer Hardware, Computer Software, Semiconductors)
- How do patenting rates differ across specific companies, organizations, and sectors (e.g., government, academic, industry)?

In addressing these questions, this report also looks at how some of the trends over the past five years are similar to or different from the previous study.

While a wealth of evidence documents the underrepresentation of women in computing and information technology (IT), most of this evidence currently takes the form of "headcount" metrics - that is, metrics that identify the number or percentage of women in technical occupations or their retention, promotion, and attrition rates. But simply paying attention to how many women are in these occupations tells us very little about what they are actually doing and to what extent they are able to meaningfully contribute to technical innovation. And in fact, we know that even when companies diversify their workforces, members of historically marginalized groups often still face disproportionate difficulty accessing core, creative, technical roles - the place where innovation so often happens. ${ }^{1}$

Of course, assessing what women are doing is much more difficult than simply counting how many are present. But we must find ways to do this if we are to truly increase women's meaningful and influential participation in creating the technology of the future. In examining gendered patenting rates, this study serves as one attempt to better understand these dynamics. While patenting, is certainly not the only measure of one's ability to contribute to innovation, it is one important measure of innovation and influence in IT and computing. As a result, examining women's IT patenting rates is important for helping us understand women's involvement in the recognized and rewarded aspects of IT innovation, research, and development. (For related work we are doing to better understand women's ability to contribute meaningfully to innovation, see our PowerTilt study and assessment tool, designed to help technical teams assess how influence operates on their teams, especially when it comes to decision-making around innovation).

Identifying the current state of affairs in women's patenting also can provide a benchmark against which to measure future efforts to increase women's patenting activities. In addition, examining differences in women's patenting across industry subcategories and across specific organizations is important for uncovering potential areas for future research - research into "what works" in those companies that may have higher rates of patenting for women.

It is also worth noting a couple of limitations in examining women's patenting rates. The first is that, in this report we are unable to address important intersections of race and gender, given the fact that the U.S. Patent and Trademark Office does not collect demographic information by race/ethnicity. Finding ways to understand differences in patenting rates among women diverse in race and other identities is important work, however. Also in this report, our gender comparisons are limited to men and women since there is also no way to identify people who identify in non-binary ways. We aim to challenge the gender binary by explicitly acknowledging that this conception and methodology otherwise runs the risk of reinforcing it.


## I. Summary of Findings

- Percentage of patents with at least one woman inventor. In the 41-year period covered by this study (1980-2020) approximately $16 \%$ of U.S.-invented IT patents have at least one woman inventor. This reflects an increase from the previous report (1980-2010) when about $13 \%$ of U.S.-invented IT patents had at least one woman inventor.
- When only considering the last 5-years, $20 \%$ of all U.S.-invented IT patents had at least one woman inventor. Just 5 years before (2011-2015) the percentage was $18 \%$.
- Percentage of patents invented by women, when accounting for multiple inventors.

Since many patents have multiple inventors, it is more accurate to attribute only a fraction of the patent to women (for example, a patent with two women inventors and one man inventor counts as $2 / 3$ women and $1 / 3$ men). Counting this way over the 41 -year period, $7.8 \%$ of the U.S.-invented IT patents were produced by women inventors; $9.1 \%$ were produced by women in the last five years.

The chart below illustrates how the above updated findings compare to the original report findings.

|  | Original Report <br> Years <br> $(1980-2005)$ | Total Years <br> Studied <br> $(1980-2020)$ | Last 5 Years <br> $(2016-2020)$ |
| :--- | :---: | :---: | :---: |
| \% of patents with at least one <br> woman inventor (e.g., any patent with at <br> least one woman inventor is counted) | $9 \%$ | $16 \%$ | $20 \%$ |
| \% of patents invented by women, when <br> accounting for multiple inventors (e.g., <br> a patent with 2 men and 1 woman inventor <br> ( counted as 2/3 men and 1/3 women) | $4.7 \%$ | $7.8 \%$ | $9.1 \%$ |

- Long-term trends in women's patenting rates. Although the overall level of women's participation in IT patents is still relatively low, the trends are somewhat promising. While the rate in 1980 was nearly $2 \%$, the rate in 2020 has increased to approximately $10 \%$, so continuous progress is occurring.
- Long-term trends in actual numbers of women's patenting (as compared to IT patenting overall). In general, IT patenting has grown substantially over the 41-year period. For women inventors to increase their share of patenting during this period, their patenting had to increase by even higher growth rates. For example, overall U.S. IT patenting increased almost 17-fold from 27,153 patents in 1980-84 to 452,315 total patents in 2016-2020. For the same time periods, U.S. women's IT patenting saw a nearly 56 -fold increase. This is particularly noteworthy because the percentage of women employed in IT remained relatively flat, declining slightly during the past 41-year time period.
- Differences in subfield. When considering computing subfields, two bright spots emerge in Artificial Intelligence/Machine Learning where $11.6 \%$ of recent patents are women-invented and Computer Software where $10.6 \%$ of recent patents are women-invented. While these percentages are still low, they compare favorably to the $9.6 \%$ figure for all of IT in 2020.
- Citation rates. Mixed-gender teams still produce the most highly cited patents, with citation rates 30-50\% higher than the norm for patents of similar age and type. Mixed-gender teams average more inventors than either men- or women-only teams, and controlling for size largely accounts for this increased citation rate. Further research is needed to determine exactly why larger teams produce more highly cited patents. For now, a likely explanation is the fact that during development, inventors and organizations often have an idea of whether an invention is likely to be of significant importance, and that these projects attract more resources and inventors as organizations try to accelerate their development. In addition, it is also possible that originality and diverse thinking do, in fact, influence citation rates but that, at this time, we do not have sensitive enough measures to capture or fully understand these relationships.
- Women's patenting rates in individual companies. Women's patenting rates differ widely from one organization to another. For example, several companies were shown to have 20\% to $30 \%$ of their patents with at least one woman, while, as in the original 2007 report, some companies still have fewer than $5 \%$ of their patents naming a woman inventor. Thus, while some companies still have very low rates of women inventors, at some companies the level of women's inventorship in IT is quite high and steadily increasing. This suggests that individual organizational environments do matter and can influence women's patenting patterns. More research is needed to determine the conditions and practices that foster or inhibit women's patenting.




## II. Methodology

To update the original report, the National Center for Women \& Information Technology commissioned 1790 Analytics to analyze U.S. IT patents granted by the U.S. Patent and Trademark Office between 2010-2020, the years since the last report was published. For purposes of this and the previous study, IT patents were defined as any patent that fit into the following categories: Communications, Computer Hardware, Computer Peripherals, Computer Software, Semiconductors/Solid State Devices, Cybersecurity, and Robotics and Intelligent Manufacturing. The last two categories were not part of the earlier studies and have been added for the first time here because they are currently important areas within IT. To identify IT patents, 1790 Analytics used a well-defined set of patent filters consisting of patent classifications and keywords for identifying patents in these categories. This set of patent filters has been tested and refined by 1790 Analytics in previous work.

Included patents were limited to those granted by the U.S. Patent and Trademark Office because the U.S. is one of the largest consumers of IT products. As a result, any company wishing to sell these products in the United States would need to obtain a U.S. patent. Figure $\mathbf{1}$ shows the distribution of U.S. Information Technology patents by inventor country. Roughly 70\% of all IT U.S. patents are produced by U.S. and Japanese inventors. Given this distribution, the content of this report focuses on the findings for U.S.-invented IT patents.

FIGURE 1. Top Inventor Countries: Percentage of Patents by Inventor Country (U.S. Information Technology Patents Granted 1980-2020)


## B. Name Matching Procedure

Unfortunately, the U.S. Patent and Trademark Office does not record the gender of the inventors for each patent; therefore, 1790 Analytics used the names given on the patents as indicators of gender. A majority of these names are gender-specific (e.g. John, Robert, Susan), so one could easily scan this list and assign gender to each name. However, a much more precise and automated process was needed for identifying thousands of names that rank lower than the top 150. To do so, 1790 Analytics used the Social Security Administration (SSA) database which maintains a list of the top 1000 most popular baby names each year from 1900-2019. This established a list of 4,000+ unique names that could be matched to the IT patent database.

Gender-ambiguous names (e.g. Terry, Lee, Chris, and Jan), required a number of other steps to determine gender. First, whenever possible, both the first name and the middle name were used. For example, if the name is Terry James Smith, the gender is assigned as man, while Terry Louise Smith would be assigned as woman. This is not always possible, however, because often only a middle initial is listed on the patent. In this case, 1790 Analytics used the SSA database records for how many boys and girls are given a name. These percentages were used to decide what percentage of patents to count as "men" and "women." For example, the SSA database indicates that $82 \%$ of people named Terry are men and $18 \%$ are women; therefore, if Terry is listed as a first inventor 749 times, $82 \%$ of the 749 patents are assigned to the men count and $18 \%$ to the women count. To be as accurate as possible we used both the first name and the middle name to determine gender. For example, if the first name is Terry, we try to match the middle name. Hence, if the name is Terry James Smith it'd be counted as a man, while Terry Louise Smith is counted as a woman. This is not always possible, because often only a middle initial is listed on the patent.

To augment the SSA list, a set of 200+ first names were identified via a web search for names that are prominent on several hundred patents but that are not typical American names. For example, the name Sanjay can be found on 676 U.S.-invented IT patents but is not on the SSA list. To identify gender for these names 1790 Analytics identified websites of professors on the world wide web via a search such as ('Sanjay') and ('professor' or 'cv' or 'department' or 'resume') - since university professors often include a photograph on their resumes. When possible, a set of 10 or more websites were identified in order to create a multiplier for names that could go with either gender.


Next, we remove any names that are truly ambiguous. For example, we keep Terry since 82\% of the time it is a man's name. However for any names in the $50 \%-75 \%$ man or woman range (e.g. Avery or Taylor) we discard the name as ambiguous.

We also augmented the process with multiple software libraries. In the 2010 report we augmented the name matching with the Genderyzer web site (http://jofish.com/cgi-bin/genderyze.py) to identify names that are not found in the Social Security database.

For this analysis we also tested a Python library called GenderGuesser (https://pypi.org/project/ gender-guesser/) previously known as sexMachine. The advantage of this library is that it takes a country name as a parameter (e.g. Jean (USA) = woman but Jean (France) = man).

In a large test set of U.S.-invented patents the GenderGuesser process sees $6.67 \%$ women's inventorship while the 1790 process sees $6.71 \%$ so they match within 4 one hundredths of one percent. The 1790 process has slightly fewer unknowns because it involved the hand search of web CV's with pictures discussed above.

In the end, we combined GenderGuesser to the process in the following way:

1. Cases that may have been unknown in previous studies but could be identified by the GenderGuesser were added into this study.
2. Cases where there were contradictions in gender between the models were mostly added to the ambiguous category (except for large patenting names that were looked up by hand).

Overall, this doesn't change the trends in women's inventorship in any meaningful way. It slightly reduces the number of unknown gender cases and slightly increases the number of ambiguous gender cases.

In total, $96.1 \%$ of the U.S.-invented patents had at least one gender matchable name. Most patents have more than one inventor. The typical U.S.-invented IT patent has 2.58 U.S. inventors of which 2.29 or 89\% were matched.


## PROCEDURE FOR ASSIGNING INVENTORSHIP ON MULTIPLE-INVENTOR PATENTS

When multiple inventors produce a patent, accurately crediting the inventorship of that patent becomes difficult. Sometimes companies list the primary inventor first; however, many companies list all inventors alphabetically. As a result, identifying the key researcher and the relative contributions of each author is impossible. Despite this difficulty, many analysts in the industry do assign the patent to the first inventor. Because of this precedent, this report also presents results by first inventor, where the gender of the first inventor determines whether the patent is counted as "man" or "woman" invented.

To enhance our understanding of women's patenting, however, we also present results using two other counting methods: 1) adding all patents that have at least one woman inventor to the women's count and 2) "fractionally attributing" inventorship for each patent. While the first method helps identify patents that would have been overlooked when counting by first author only, it also tends to overestimate women's patenting because, for example, a patent that is invented by one woman and one man would be counted as a woman's patent.

To account for this discrepancy, we also then present findings by "fractional attribution," a method that allows us to account for multiple inventors. For example, suppose a patent lists Susan, Lisa, and John as inventors. In this case $2 / 3$ of the patent is assigned to the women's count and $1 / 3$ to the men's count. If instead it is invented by Terry, John, and Lisa, Fractional Attribution is used for Terry. This, then, assigns $\left(0.82^{*}(1 / 3)+1 / 3\right)=0.61$ to the men's count and $\left(0.18^{*}(1 / 3)+\right.$ $1 / 3)=0.39$ to the women's count. The next section first presents the results by first inventor and then by fractional attribution of inventorship.

## III. Results

## Gendered IT Patenting Rates

As discussed in the previous section, determining "inventorship" is more difficult than it may first appear, and different counting methods present slightly different pictures. To give the fullest picture, this section presents the percentage of patents invented by women in three different ways: 1) percentage of patents that have a woman listed as the first inventor, 2) percentage of patents with at least one woman inventor, and 3) percentage of patents invented by women when accounting for multiple inventors on one patent.

Percentage of Patents with at Least One Woman Inventor. In the 41-year period covered by this study (1980-2020) approximately $16 \%$ of U.S.-invented IT patents have at least one woman inventor. This reflects an increase from the previous report (1980-2010) when about $13 \%$ of U.S.-invented IT patents had at least one woman inventor.

When considering only the last 5-years, $20 \%$ of all U.S.-invented IT patents had at least one woman inventor. Just 5 years before that in the period 2011-15 the percentage was 18\%.

Percentage of Patents with Women as "First Inventors. When assigning inventorship by first inventor, $93 \%$ of the matched first inventors on U.S.-invented patents are men and $7 \%$ of the matched first inventors are women (roughly 11\% could not be gender matched) (see Figure 2). Women fared slightly better over the past 5 years (2016-2020) with $8 \%$ of patents listing a woman first inventor.



## Percentage of Women-invented Patents When Accounting for Multiple Inventors.

When assigning authorship fractionally - where a patent with 2 men and 1 woman inventor is counted $2 / 3$ men and $1 / 3$ women (see methods for more detail) - the numbers shift slightly, with $8 \%$ of U.S.-invented patents being women-invented and $92 \%$ men-invented (see Figure 3).

FIGURE 3. Fractionally Attributed Inventors by Gender U.S.-Invented Information Technology Patents 1980-2020


This is up slightly from the first report when $4.7 \%$ of patents were women-invented. Again, we also see improvement in the last 5 years. Figure 4 shows 9\% of IT patents granted 2016-2020 are women-invented.

FIGURE 4. Fractionally Attributed Inventors by Gender U.S.-Invented Information Technology Patents 2016-2020



To further illuminate the nature of gender and team collaboration over the 41-year period, it is helpful to consider how many U.S.-invented IT patents are produced by teams of multiple inventors and the gender makeup of these collaborative teams (see Figure 5). Roughly 35\% of patents are produced by a single man inventor, while only $2.1 \%$ are produced by a single woman inventor. The second most frequent team composition is two men inventors, accounting for $25 \%$ of patents; thus, $65 \%$ of all patents are produced by teams of one or two men. While approximately $16 \%$ of patents list at least one woman, most of these are on teams with at least one man.

FIGURE 5. Collaboration Statistics for U.S.-Invented Information Technology Patents 1980-2020 (Counts of Gender Matched U.S. Co-invented Patents)

| \# of Men Co-inventors | \# of Women Co-inventors | \# of Patents | \% of Total | Cumulative \% of Total |
| :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 455479 | 34.53\% | 34.53\% |
| 3+ | 0 | 334221 | 25.34\% | 59.88\% |
| 2 | 0 | 315192 | 23.90\% | 83.77\% |
| 3+ | 1 | 61321 | 4.65\% | 88.42\% |
| 1 | 1 | 48105 | 3.65\% | 92.07\% |
| 2 | 1 | 42970 | 3.26\% | 95.33\% |
| 0 | 1 | 27883 | 2.11\% | 97.44\% |
| 3+ | 2 | 11678 | 0.89\% | 98.33\% |
| 1 | 2 | 6083 | 0.46\% | 98.79\% |
| 2 | 2 | 5858 | 0.44\% | 99.23\% |
| 3+ | 3+ | 3592 | 0.27\% | 99.51\% |
| 0 | 2 | 3338 | 0.25\% | 99.76\% |
| 1 | 3+ | 1200 | 0.09\% | 99.85\% |
| 2 | 3+ | 1194 | 0.09\% | 99.94\% |
| 0 | 3+ | 778 | 0.06\% | 100.00\% |
|  |  | 1318892 | 100.00\% |  |

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Figure 6 shows a slight improvement in the last 5 years with almost 20\% of patents having at least one woman inventor.

FIGURE 6. Collaboration Statistics for U.S.-Invented Information Technology Patents 2016-2020 (Counts of Gender Matched U.S.-Co-invented Patents)

| \# of Men Co-inventors | \# of Women Co-inventors | \# of Patents | \% of Total | Cumulative \% of Total |
| :---: | :---: | :---: | :---: | :---: |
| 1 | 0 | 117960 | $30.05 \%$ | $30.05 \%$ |
| $3+$ | 0 | 108052 | $27.53 \%$ | $57.58 \%$ |
| 2 | 0 | 89365 | $22.77 \%$ | $80.35 \%$ |
| $3+$ | 1 | 23132 | $5.89 \%$ | $86.24 \%$ |
| 1 | 1 | 15911 | $4.05 \%$ | $90.29 \%$ |
| 2 | 1 | 15090 | $3.84 \%$ | $94.14 \%$ |
| 0 | 2 | 9060 | $2.31 \%$ | $96.44 \%$ |
| $3+$ | 2 | 4955 | $1.26 \%$ | $97.71 \%$ |
| 2 | $2+$ | 2430 | $0.62 \%$ | $98.33 \%$ |
| $3+$ | 2 | 1621 | $0.60 \%$ | $98.93 \%$ |
| 0 | $3+$ | 1276 | $0.41 \%$ | $99.34 \%$ |
| 1 | $3+$ | 535 | $0.33 \%$ | $99.67 \%$ |
| 2 |  | 313 | $0.12 \%$ | 9 |
| 0 |  |  |  | $0.08 \%$ |

Trends in Women Patenting Patterns Over Time. Although overall patenting rates for women have been and remain quite low, the picture improves when we look at trends over time. While women account for only $8 \%$ of total U.S.-invented patents (when counting fractionally), that percentage has increased steadily from nearly $2 \%$ in 1980 to $6 \%$ in 2001 to nearly $10 \%$ in 2020 - nearly a 5-fold increase (see Figure 7).

FIGURE 7. Percent of Women-Invented Patents over Time (U.S.-Invented Technology Patents - Fractional Counting)
$\_$\% WOMEN INVENTED

- 41 YEAR AVERAGE (\% WOMEN INVENTED)



The combination of this 5 -fold increase in the percentage of women-invented patents with the 20 -fold increase in U.S.-invented IT patenting (see Figure 8) translates to a roughly 100 -fold increase in women's IT patenting for the period.

This is particularly noteworthy because, during the same period, the percentage of women employed in IT has remained relatively flat (at about 26\%), even declining somewhat from 32\% in 1983 to 25\% in 2009 (with a high of 37\% in 1990-1991).

FIGURE 8. All U.S.-Invented Information Technology Patents Over Time


## PATENTING RATES BY INFORMATION TECHNOLOGY SUBCATEGORY

In this section, we explore how women's patenting rates vary across IT subcategories, which, for the most part, mirror the trends in IT patenting overall. Figure 9 shows the share of patents attributed to women over time in each of the subcategories. Note that the recently added subcategories (Al/Machine Learning and Robotics) do not go back to 1980 because there were few patents prior to 2000 or prior to 2010 for the AI/Machine Learning category. We notice that the share of women patenting is growing in each category over time in most cases. One exception is the $\mathrm{Al} / \mathrm{ML}$ category where the percentage of women's inventorship has been largely flat. However, although it is not trending upwards, the share of patents is highest in this category. The share of patents attributed to women is lowest in Cybersecurity and is actually lower than it was in 2008.

FIGURE 9. Percent of Women-Invented Patents Over Time (U.S.-Invented Information Technology Patents By Subcategory) (Trendlines Smoothed via 5-Year Running Averages)

- SEMICONDUCTORS/SOLID STATE DEVICES
-- ROBOTICS AND INTELLIGENT MANUFACTURING
- CYBERSECURITY
- COMPUTER SOFTWARE
- COMPUTER PERIPHERALS
-- COMPUTER HARDWARE
- communications
-- ARTIFICIAL INTELLIGENCE/MACHINE LEARNING


Figure 10 contains collaboration patterns for the subcategories of Information Technology. In general, men-only teams in these subcategories produce 84-86\% of all patents, while mixed-gender teams account for 11-14\% of all patents, and women-only teams account for $2-3 \%$ of patents. The exceptions are Computer Software and AI/ML. In these categories there are more women-invented patents, more mixed-gender team patents and, consequently, fewer men-only patents.

FIGURE 10. Men and Women Collaboration Statistics by Category
U.S.-Invented U.S. Information Technology Patents

|  |  | Women Only |  | Mixed-Gender Team |  | Men Only |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Sub-Category | \# Matchable Patents | Count | \% | Count | \% | Count | \% |
| Artificial Intelligence/Machine Learning | 15,076 | 519 | 3.4\% | 3,291 | 21.8\% | 11,266 | 74.7\% |
| Communications | 343,305 | 8,375 | 2.4\% | 38,954 | 11.3\% | 295,976 | 86.2\% |
| Computer Hardware | 318,497 | 6,737 | 2.1\% | 43,048 | 13.5\% | 268,712 | 84.4\% |
| Computer Peripherals | 107,056 | 2,579 | 2.4\% | 15,471 | 14.5\% | 89,006 | 83.1\% |
| Computer Software | 273,472 | 8,349 | 3.1\% | 47,655 | 17.4\% | 217,468 | 79.5\% |
| Cybersecurity | 85,522 | 1,884 | 2.2\% | 12,264 | 14.3\% | 71,374 | 83.5\% |
| Robotics and Intelligent Manufacturing | 18,541 | 353 | 1.9\% | 2,636 | 14.2\% | 15,552 | 83.9\% |
| Semiconductors/Solid-State Devices | 276,562 | 5,959 | 2.2\% | 36,873 | 13.3\% | 233,730 | 84.5\% |

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Figure 10, however, does not account for the varying numbers of men and women on different collaboration teams. Many of these teams include several men but only one woman. To get a better understanding of the contribution of each gender, inventorship is again computed fractionally (where a patent with 2 men and 1 woman is counted as $2 / 3$ men and $1 / 3$ women). From this perspective, we see that U.S. women are responsible for about $9 \%$ of the patents on average, up from 2.7\% forty years ago (see Figure 11).

FIGURE 11. Percentage of Women-Invented U.S. Information Technology Patents for Two Time Periods (Fractional Counts 1980-84 and 2016-20)

## U.S.-Invented U.S. Information Technology Patents

|  |  | 1980-84 |  |  |  | 2016-20 |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Category | Patents | Women Patents | $\begin{aligned} & \text { Women } \\ & \text { of Total } \end{aligned}$ | \# Men Patents (Fractional) | Men \% of Total | Patents | $\begin{gathered} \text { \# } \\ \text { Women } \\ \text { Patents } \end{gathered}$ | $\begin{aligned} & \text { Women } \\ & \% \text { of } \\ & \text { of Total } \end{aligned}$ | \# Men Patents (Fractional) | Men \% of Total |
| Artificial Intelligence/Machine Learning Learning | N/A | N/A | N/A | N/A | N/A | 11388 | 1340 | 11.77\% | 10048 | 88.23\% |
| Communications | 8629 | 208 | 2.41\% | 8421 | 97.59\% | 97067 | 8291 | 8.54\% | 88776 | 91.46\% |
| Computer Hardware | 4227 | 100 | 2.35\% | 4127 | 97.65\% | 103866 | 8890 | 8.56\% | 94976 | 91.44\% |
| Computer Peripherals | 3868 | 86 | 2.24\% | 3782 | 97.76\% | 36019 | 3478 | 9.66\% | 32541 | 90.34\% |
| Computer Software | 1192 | 44 | 3.66\% | 1148 | 96.34\% | 86994 | 9258 | 10.64\% | 77736 | 89.36\% |
| Cybersecurity | N/A | N/A | N/A | N/A | N/A | 41861 | 3320 | 7.93\% | 38541 | 92.07\% |
| Robotics and Intelligent Manufacturing | N/A | N/A | N/A | N/A | N/A | 7507 | 547 | 7.28\% | 6960 | 92.72\% |
| Semiconductors/Solid-State Devices | 9237 | 299 | 3.24\% | 8938 | 96.76\% | 67613 | 5814 | 8.60\% | 61799 | 91.40\% |
| All Information Technology | 27153 | 737 | 2.71\% | 26416 | 97.29\% | 452315 | 40937 | 9.05\% | 411377 | 90.95\% |

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Figure 12 shows the trends of women's patenting over time, comparing rates of patenting in each subcategory from 1980-1984 to rates from 2016-2020. While the numbers are still low, slow progress has been made in each category.

FIGURE 12. \% of Women-Invented U.S. Information Technology Patents (Fractional Counts 1981-84 and 2016-20)

1980-84
2016-20
\% U.S. Women-Invented U.S. IT Patents 1980-84 and 2016-20



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## Citation Analysis

Background on Citation Analysis. In this section we examine citation rates for patents invented by women, men, and mixed-gender teams. High citation rates indicate that a patent contains technological information of particular importance. As a result, examining the citation rates of women-invented patents is one way of measuring their influence, importance, and potential return on investment. For example, companies with high citation rates have been shown to perform better in the stock market and have experienced increases in sales and profits. ${ }^{2}$

Determining citation rates, however, involves more than simply counting the number of citations a particular patent has accrued. For example, older patents are likely to be more highly cited since they have had more time to accrue citations. Furthermore, average citation rates differ across technologies. A patent with 10 citations, therefore, may be very highly cited, or not very highly cited, depending on its age and technology category.

To account for these differences, citation counts were normalized by technology and year in order to determine the 'expected cite count' for patents from the same year and technology class. Dividing the citation count of a particular patent by the expected count results in a "citation index," a normalized measure of the impact of a particular patent. For example, a citation index of 9.99 suggests the patent is cited about 10 times as often as typical patents of the same age and technology class.

The citation index can be extended beyond a single patent to a set of patents (i.e., all men-invented communication patents, all women-invented communication patents, or all mixed-gender team invented communication patents - see Figure 13). In fact, applying the citation index to a set of patents tends to provide a more accurate picture since a larger patent set will dilute the effects of any outliers. The citation index for a set of patents is determined by taking the sum of the citations for that set (i.e., the sum of the citations for all men-invented communication patents) and dividing by the sum of the expected citation counts for all communication patents. ${ }^{3}$ Applying the citation index to these patent sets allows us to compare patent sets of differing sizes with different age profiles (e.g., compare the averages for all of the men-invented communications patents, for all of the women-invented communication patents, for all of the mixed-gender team invented communication patents).

[^0]FIGURE 13. \% of Women-Invented U.S. Information Technology Patents (Fractional Counts 1981-84 and 2016-20)

$\square$ HIGHEST CITED PATENT SET $\square$ SECOND HIGHEST CITED PATENT SET $\square$ THIRD HIGHEST CITED PATENT SET

U.S.-Invented Information Technology Patents

|  | Women Only Invented |  |  | Men Only Invented |  | Mixed-Gender Team |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Artificial Intelligence/Machine Learning | \# Patents | Citation Index | \# Patents | Citation Index | \# Patents | Citation Index |
| Communications | 519 | 0.89 | 11266 | 1.30 | 3291 |  |
| Computer Hardware | 8375 | 1.02 | 295976 | 1.21 | 38954 |  |
| Computer Peripherals | 6737 | 1.09 | 268712 | 1.26 | 430 |  |
| Computer Software | 2579 | 1.30 | 89006 | 1.33 | 1.34 |  |
| Cybersecurity | 8349 | 1.12 | 217468 | 1.28 | 15471 |  |
| Robotics and Intelligent Manufacturing | 353 | 1.34 | 71374 | 1.51 | 47655 |  |
| Semiconductors/Solid-State Devices | 5959 | 1.13 | 15552 | 1.48 | 12264 |  |
|  | 1.17 | 233730 | 1.28 | 1.50 |  |  |

Differences in Citation Rates for Men, Women, and Mixed-Gender Teams. As illustrated in Figure 13, patents ${ }^{4}$ invented by mixed-gender teams - teams consisting of at least one woman and at least one man - are cited more often than patents invented by women-only or men-only teams (with the exception of robotics and cybersecurity, where men-only teams are more highly cited). In the original study, we noted that both the diversity of thought and the fact that mixed-gender teams tend to be larger might be possible explanations that would lead to more innovative inventions. We have since investigated the relationship between mixed-gender teams and higher citation rates further and found that controlling for size largely accounts for this increased citation rate.

So why exactly do larger teams produce more highly cited patents? We investigated a few possible explanations, but, to date, the answer remains unclear. First, the originality index also rises with team size. This index measures the extent to which a patent draws on a wider range of prior art or different kinds of technologies. In other words, a relatively simple or incremental invention will have a lower index than complex inventions drawing from multiple areas of technical expertise. Initially, we thought perhaps the higher originality indexes of larger teams might explain their higher citation rates. A regression analysis, however, revealed that originality has very little explanatory power for higher citation rates once team size is factored in. In other words, team size seems to matter more than the originality index when predicting citation rates. This result, however, might be because the originality index is a rather insensitive measure - that is, it is primarily designed to distinguish highly original patents rather than to measure smaller differences in originality.
${ }^{4}$ Citation indexes are based on the average of all U.S. patents in each technology class invented anywhere in the world (including the U.S., Japan, and all other countries filing patents). In general, we see that U.S.-invented IT patents have a higher citation index than Japanese- invented IT patents. All of the U.S.-invented patent sets have citation indices exceeding 1.0, suggesting that the U.S.- invented IT patents are cited more often than average for all U.S. patents invented in other countries of the same age and technology class.

We also found no consistent significant relationship (using one-way ANOVAs) between the citation index and team characteristics such as self-citations, sector of organization (e.g., university, industry, non-profit) or country of organization. Further research is needed to determine exactly why larger teams produce more highly cited patents. For now, a likely explanation is the fact that during development, inventors and organizations often have an idea of whether an invention is likely to be of significant importance. Technologies that look particularly promising will attract more resources and inventors as organizations try to accelerate their development. In addition, inventors will happily join technical projects that look to be particularly promising. Similarly, it is also still possible that originality and diverse thinking do, in fact, influence citation rates but that, at this time, we do not have sensitive enough measures to capture or fully understand these relationships.

## ORGANIZATIONAL DIFFERENCES

This section explores women's IT patenting patterns across different organizations. This analysis reveals that women's patenting rates differ widely from one organization to another. In both "small patenting entities" (those with less than 100 patents during 2016-2020), and "large patenting entities" (those with at least 350 patents during 2016-2020), men, women, and mixed-gender team patenting rates vary widely.


Figure 14 identifies the top 10 "small patenting entities" with the lowest percent of men-only patents in each of the five industry subcategories, while Figure $\mathbf{1 5}$ shows the top 10 "large patenting entities" (Identifying the lowest percent of men-only patents is the easiest way to identify companies with the highest rates of women-only or mixed-gender team patents overall.) The results identify a very wide range of differences among companies, with men's patenting rates in "small entities" ranging from a low of $3 \%$ and a high of $70 \%$. The "large entities" also display a range, but a much narrower range from a low of $63 \%$ and a high of $80 \%$.

FIGURE 14. Top 10 "Small Patenting Entities" with Women Inventorship 2016-20 (Organizations with 25 to 100 Patents 2016-20; Lowest \% of Men Only Patents)

## U.S.-Invented U.S. Information Technology Patents

| Categ | Assignee | $\left\|\begin{array}{c} \# \\ \text { Patents } \\ 2016-20 \end{array}\right\|$ | \% <br> Mixed- <br> Gender Teams <br> Team | $\begin{gathered} \text { \% } \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{aligned} & \% \\ & \text { Men } \\ & \text { Monly } \end{aligned}$ | Categ | Assignee | $\begin{gathered} \# \\ \text { Patents } \\ \text { Pati6-20 } \end{gathered}$ |  | $\begin{gathered} \% \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{gathered} \% \\ \text { Men } \\ \text { Menly } \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Artificial Intelligence/Machine Learning |  |  |  |  |  | Computer Software |  |  |  |  |  |
| 1 | Gyrfalcon Tech. Inc. | 40 | 50.0\% | 42.5\% | 7.5\% | 1 | Kofax Inc | 42 | 88.1\% | 0.0\% | 11.9\% |
| 2 | Snap Inc | 36 | 36.1\% | 25.0\% | 38.9\% | 2 | Transform Sr Brands | 28 | 42.9\% | 17.9\% | 39.3\% |
| 3 | Ford Motor Co. | 60 | 55.0\% | 3.3\% | 41.7\% | 3 | NYSE Group | 29 | 48.3\% | 10.3\% | 4.4\% |
| 4 | NVIIIA Corp. | 34 | 52.9\% | 2.9\% | 44.1\% | 4 | Nice Systems Ltd | 43 | 58.1\% | 0.0\% | 4.9\% |
| 5 | Pearson Plc | 28 | 50.0\% | 0.0\% | 50.0\% | 5 | Dexcom Inc | 94 | 56.4\% | 0.0\% | 43.6\% |
| 6 | State Farm Insurance Co. | 33 | 48.5\% | 0.0\% | 51.5\% | 6 | Adidas AG | 40 | 55.0\% | 0.0\% | 45.0\% |
| 7 | Brain Corporation | 46 | 47.8\% | 0.0\% | 52.2\% | 7 | Mass Mutual Life Insurance | 41 | 51.2\% | 2.4\% | 46.3\% |
| 8 | Accenture Ltd. | 71 | 35.2\% | 11.3\% | 53.5\% | 8 | MoneyGram International Inc | 38 | 47.4\% | 5.3\% | 47.4\% |
| 9 | Verizon Comm. Inc | 75 | 32.0\% | 8.0\% | 60.0\% | 9 | Western Union Co | 42 | 40.5\% | 11.9\% | 47.6\% |
| 10 | Bank of America Corp. | 64 | 34.4\% | 0.0\% | 65.6\% | 10 | ASML Holding NV | 63 | 47.6\% | 4.8\% | 47.6\% |
| Communications |  |  |  |  |  | Cybersecurity |  |  |  |  |  |
| 1 | Movandi Corp | 61 | 96.7\% | 0.0\% | 3.3\% | 1 | Flexiworld Technologies | 26 | 96.2\% | 0.0\% | 3.8\% |
| 2 | TPLab Inc | 29 | 65.5\% | 27.6\% | 6.9\% | 2 | Itron Inc. | 29 | 62.1\% | 0.0\% | 37.9\% |
| 3 | Uhnder Inc | 32 | 81.2\% | 9.4\% | 9.4\% | 3 | Convida Wireless LLC | 26 | 57.7\% | 0.0\% | 42.3\% |
| 4 | Enseo Inc | 65 | 877\% | 0.0\% | 12.3\% | 4 | Sap SE | 40 | 30.0\% | 15.0\% | 55.0\% |
| 5 | Convida Wireless LLC | 98 | 62.2\% | 0.0\% | 37.8\% | 5 | Servicenow Inc. | 63 | 36.5\% | 1.6\% | 61.9\% |
| 6 | Tango Networks Inc | 36 | 58.3\% | 0.0\% | 41.7\% | 6 | State Farm Insurance Co. | 66 | 34.8\% | 3.0\% | 62.1\% |
| 7 | Toshiba Corp | 26 | 34.6\% | 23.1\% | 42.3\% | 7 | Unisys Corp. | 51 | 33.3\% | 3.9\% | 62.7\% |
| 8 | Allstate Corp | 56 | 42.9\% | 10.7\% | 46.4\% | 8 | Early Warning Services | 27 | 37.0\% | 0.0\% | 63.0\% |
| 9 | Witricity Corp | 39 | 51.3\% | 0.0\% | 48.7\% | 9 | NEC Corp | 37 | 35.1\% | 0.0\% | 64.9\% |
| 10 | Enghouse Systems Ltd. | 26 | 42.3\% | 7.7\% | 50.0\% | 10 | Maxlinear Inc | 26 | 34.6\% | 0.0\% | 65.4\% |
| Computer Hardware |  |  |  |  |  | Robotics and Intelligent Manufacturing |  |  |  |  |  |
| 1 | Ubiome Inc. | 53 | 100.0\% | 0.0\% | 0.0\% | 1 | Brain Corporation | 74 | 44.6\% | 0.0\% | 55.4\% |
| 2 | Gyrfalcon Tech. Inc. | 30 | 63.3\% | 26.7\% | 10.0\% | 2 | Global Foundries Inc | 47 | 34.0\% | 4.3\% | 61.7\% |
| 3 | Alibaba Group Holding Ltd | 63 | 20.6\% | 55.6\% | 23.8\% | 3 | Harvard University | 31 | 35.5\% | 0.0\% | 64.5\% |
| 4 | Mass Mutual Life Ins. | 26 | 34.6\% | 19.2\% | 46.2\% | 4 | Massachusetts Institute of Technolog | 41 | 26.8\% | 4.9\% | 68.3\% |
| 5 | Winbond Electronics Corp. | 39 | 41.0\% | 12.8\% | 46.2\% | 5 | Ford Motor Co. | 29 | 31.0\% | 0.0\% | 69.0\% |
| 6 | University of South Florida | 30 | 36.7\% | 16.7\% | 46.7\% | 6 | Intel Corporation | 55 | 30.9\% | 0.0\% | 69.1\% |
| 7 | Itron Inc. | 38 | 52.6\% | 0.0\% | 47.4\% | 7 | Berkshire Grey | 34 | 29.4\% | 0.0\% | 70.6\% |
| 8 | United States Postal Serv | 33 | 42.4\% | 9.1\% | 48.5\% | 8 | Autodesk Inc. | 34 | 29.4\% | 0.0\% | 70.6\% |
| 9 | Razer USAInc | 40 | 45.0\% | 0.0\% | 55.0\% | 9 | General Motors Corp | 66 | 18.2\% | 10.6\% | 71.2\% |
| 10 | Ambarella Inc | 29 | 41.4\% | 3.4\% | 55.2\% | 10 | Intouch Technologies | 40 | 27.5\% | 0.0\% | 72.5\% |
| Computer Peripherals |  |  |  |  |  | Semiconductors/Solid-State Devices |  |  |  |  |  |
| 1 | Magnecomp International Ltd. | 30 | 66.7\% | 10.0\% | 23.3\% | 1 | Nanotek Instruments | 37 | 10.8\% | 89.2\% | 0.0\% |
| 2 | Bank of America Corp. | 95 | 58.9\% | 3.2\% | 37.9\% | 2 | Macronix International Co. Ltd. | 25 | 32.0\% | 56.0\% | 12.0\% |
| 3 | Wells Fargo \& Co | 25 | 52.0\% | 8.0\% | 40.0\% | 3 | PDF Solutions | 97 | 86.6\% | 0.0\% | 13.4\% |
| 4 | Corning Inc. | 53 | 56.6\% | 0.0\% | 43.4\% | 4 | Enel X North America | 29 | 69.0\% | 17.2\% | 13.8\% |
| 5 | Cerner Corporation | 33 | 48.5\% | 6.1\% | 45.5\% | 5 | Soitec SA | 32 | 28.1\% | 53.1\% | 18.7\% |
| 6 | Allscripts Software | 26 | 38.5\% | 15.4\% | 46.2\% | 6 | Navitas Semiconductor Inc. | 35 | 68.6\% | 2.9\% | 28.6\% |
| 7 | Accenture Ltd. | 36 | 41.7\% | 2.8\% | 55.6\% | 7 | Case Western Reserve University | 68 | 66.2\% | 4.4\% | 29.4\% |
| 8 | Procter \& Gamble Co. | 43 | 41.9\% | 2.3\% | 55.8\% | 8 | Integer Holdings Corp | 58 | 65.5\% | 0.0\% | 34.5\% |
| 9 | Atheer Inc | 34 | 41.2\% | 2.9\% | 55.9\% | 9 | Nike Inc | 26 | 61.5\% | 0.0\% | 38.5\% |
| 10 | Open Invention Network Llc | 77 | 18.2\% | 23.4\% | 58.4\% | 10 | GLOAb | 53 | 49.1\% | 9.4\% | 41.5\% |

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FIGURE 15. Top 10 "Large Patenting Entities" with Women Inventorship 2016-20 (Organizations with 350+ Patents 2016-20; Lowest \% of Men Only Patents)

## U.S.-Invented U.S. Information Technology Patents

| Categ | Assignee | $\left\|\begin{array}{c} \# \\ \text { Patents } \\ 2016-20 \end{array}\right\|$ | \% <br> Mixed- <br> Gender <br> Teams | $\begin{gathered} \% \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{gathered} \% \\ \text { Men } \\ \text { Monly } \end{gathered}$ | Categ | Assignee | $\begin{gathered} \# \\ \begin{array}{c} \# \\ \text { Patents } \\ \text { 2016-20 } \end{array} \end{gathered}$ | \% <br> Mixed- <br> Gender <br> Teams | $\begin{gathered} \% \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{aligned} & \% \\ & \text { Men } \\ & \text { Only } \end{aligned}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Artificial Intelligence/Machine Learning |  |  |  |  |  | Computer Software |  |  |  |  |  |
| 1 | Microsoft Corporation | 515 | 515 | 2.3\% | 63.7\% | 1 | United Services Automobile | 352 | 46.0\% | 7.1\% | 46.9\% |
| 2 | International Business Mach | 1381 | 1381 | 4.5\% | 65.2\% | 2 | Bank of America Corp. | 583 | 45.5\% | 5.1\% | 49.4\% |
| 3 | Alphabet Inc. | 578 | 578 | 2.2\% | 78.7\% | 3 | State Farm Mutual Automob | 545 | 39.3\% | 2.4\% | 58.3\% |
| 4 |  |  |  |  |  | 4 | eBay Inc | 511 | 28.6\% | 8.2\% | 63.2\% |
| 5 |  |  |  |  |  | 5 | International Business Mach | 6315 | 30.8\% | 5.7\% | 63.5\% |
| 6 |  |  |  |  |  | 6 | Visalnc | 510 | 27.6\% | 6.7\% | 65.7\% |
| 7 |  |  |  |  |  | 7 | Microsoft Corporation | 2914 | 28.9\% | 2.5\% | 68.6\% |
| 8 |  |  |  |  |  | 8 | MasterCard Inc | 426 | 23.9\% | 5.6\% | 70.4\% |
| 9 |  |  |  |  |  | 9 | Qualcomm Inc | 937 | 21.9\% | 7.3\% | 70.9\% |
| 10 |  |  |  |  |  | 10 | Ford Motor Co. | 385 | 26.5\% | 1.6\% | 71.9\% |
| Communications |  |  |  |  |  | Cybersecurity |  |  |  |  |  |
| , | Verizon Communications Inc | 1405 | 25.4\% | 4.4\% | 70.2\% | 1 | Bank of America Corp. | 597 | 35.3\% | 3.4\% | 61.3\% |
| 2 | International Business Mach | 2410 | 25.5\% | 3.9\% | 70.6\% | 2 | Facebook Inc | 454 | 27.8\% | 2.9\% | 69.4\% |
| 3 | New T-Mobile (former T-Mo | 1851 | 25.8\% | 3.4\% | 70.8\% | 3 | International Business Mach | 3266 | 25.6\% | 4.4\% | 70.0\% |
| 4 | FacebookInc | 582 | 22.2\% | 2.7\% | 75.1\% | 4 | Capitalone | 366 | 25.4\% | 2.7\% | 71.9\% |
| 5 | Intel Corporation | 3007 | 18.8\% | 5.8\% | 75.5\% | 5 | Microsoft Corporation | 1652 | 22.7\% | 2.0\% | 75.3\% |
| 6 | Qualcomm Inc | 6890 | 21.1\% | 3.4\% | 75.6\% | 6 | Verizon Communications Inc | 487 | 19.7\% | 4.3\% | 76.0\% |
| 7 | InterDigital Inc | 936 | 22.6\% | 1.2\% | 76.2\% | 7 | Qualcomm Inc | 612 | 19.3\% | 2.9\% | 77.8\% |
| 8 | General Motors Corp | 439 | 20.0\% | 3.6\% | 76.3\% | 8 | AT\&T Inc | 895 | 17.2\% | 3.7\% | 79.1\% |
| 9 | Blackberry Ltd. | 461 | 14.5\% | 7.6\% | 77.9\% | 9 | Alphabet Inc. | 1127 | 18.3\% | 1.6\% | 80.1\% |
| 10 | Apple Inc | 2609 | 20.2\% | 1.5\% | 78.3\% | 10 | Apple Inc | 734 | 18.0\% | 0.7\% | 81.3\% |
| Computer Hardware |  |  |  |  |  | Robotics and Intelligent Manufacturing |  |  |  |  |  |
| 1 | Bank of America Corp. | 628 | 33.6\% | 2.9\% | 63.5\% | 1 | None with 350+ Patents |  |  |  |  |
| 2 | CapitalOne | 780 | 27.8\% | 2.8\% | 69.4\% | 2 |  |  |  |  |  |
| 3 | Verizon Communications Inc | 515 | 24.1\% | 4.5\% | 71.5\% | 3 |  |  |  |  |  |
| 4 | International Business Mach | 13302 | 24.6\% | 2.9\% | 72.5\% | 4 |  |  |  |  |  |
| 5 | Microsoft Corporation | 4916 | 24.8\% | 1.6\% | 73.6\% | 5 |  |  |  |  |  |
| 6 | Apple Inc | 2427 | 21.7\% | 1.0\% | 77.3\% | 6 |  |  |  |  |  |
| 7 | Qualcomm Inc | 1626 | 19.1\% | 2.8\% | 78.1\% | 7 |  |  |  |  |  |
| 8 | HPInc | 677 | 19.1\% | 2.8\% | 78.1\% | 8 |  |  |  |  |  |
| 9 | FacebookInc | 951 | 19.2\% | 2.5\% | 78.2\% | 9 |  |  |  |  |  |
| 10 | Netapp Inc | 484 | 19.0\% | 2.7\% | 78.3\% | 10 |  |  |  |  |  |
| Computer Peripherals |  |  |  |  |  | Semiconductors/Solid-State Devices |  |  |  |  |  |
| 1 | Microsoft Corporation | 2100 | 32.5\% | 1.6\% | 65.9\% | 1 | Intel Corporation | 2594 | 28.1\% | 2.0\% | 69.9\% |
| 2 | AT\& I Inc | 374 | 28.3\% | 2.7\% | 69.0\% | 2 | Applied Materials Inc. | 1978 | 26.0\% | 1.4\% | 72.6\% |
| 3 | International Business Mach | 1907 | 23.7\% | 4.5\% | 71.8\% | 3 | Universal Display | 376 | 26.6\% | 0.8\% | 72.6\% |
| 4 | Apple Inc | 2251 | 26.7\% | 1.0\% | 72.3\% | 4 | Apple Inc | 1321 | 25.2\% | 0.8\% | 74.0\% |
| 5 | Facebook Inc | 893 | 23.0\% | 4.1\% | 72.9\% | 5 | NXP Semiconductors NV | 761 | 21.2\% | 3.7\% | 75.2\% |
| 6 | Intel Corporation | 500 | 20.8\% | 3.8\% | 75.4\% | 6 | International Business Mach | 7114 | 22.5\% | 2.1\% | 75.3\% |
| 7 | Western Digital Corp. | 611 | 23.2\% | 0.7\% | 76.1\% | 7 | Qualcomm Inc | 1052 | 21.3\% | 2.9\% | 75.8\% |
| 8 | Xerox Corp | 474 | 20.7\% | 1.9\% | 77.4\% | 8 | Lam Research Corp. | 890 | 19.6\% | 1.7\% | 78.8\% |
| 9 | Amazon.com Inc. | 929 | 20.3\% | 1.9\% | 77.7\% | 9 | Cree Inc. | 392 | 18.4\% | 2.8\% | 78.8\% |
| 10 | Alphabet Inc. | 1576 | 20.3\% | 1.8\% | 77.9\% | 10 | Global Foundries Inc | 2513 | 19.1\% | 2.1\% | 78.8\% |

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When considering the bottom 10 "small patenting entities" (Figure 16) we see that in most cases men's patenting rates are at 100\%, with some companies ranging from 88-99\%.

FIGURE 16. Bottom 10 ‘Small Patenting Entities’ with Women Inventorship 2016-20 (Organizations with 25 to 100 Patents 2016-20; Highest \% of Men Only Patents)

## U.S.-Invented U.S. Information Technology Patents

| Categ | Assignee | $\left.\begin{gathered} \# \\ \text { Patents } \\ \text { Po16-20 } \end{gathered} \right\rvert\,$ | \% MixedGender Teams | $\begin{gathered} \% \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{gathered} \% \\ \text { Men } \\ \text { Only } \end{gathered}$ | Categ | Assignee | $\begin{gathered} \# \\ \text { Patents } \\ \text { Pa16-20 } \end{gathered}$ | $\begin{array}{\|c} \hline \% \\ \text { Mixed- } \\ \text { Mender } \\ \text { Teams } \end{array}$ | $\begin{gathered} \% \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{gathered} \% \\ \text { Men } \\ \text { Only } \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Artificial Intelligence/Machine Learning |  |  |  |  |  | Computer Software |  |  |  |  |  |
| 1 | Strong Force IOT Portfolio | 47 | 0.0\% | 0.0\% | 100.0\% | 1 | CFPH LLC | 96 | 0.0\% | 0.0\% | 100.0\% |
| 2 | Micron Technology Inc. | 35 | 2.9\% | 0.0\% | 97.1\% | 2 | Global Tel Link Corp | 46 | 0.0\% | 0.0\% | 100.0\% |
| 3 | Norton Lifelock (formerly Symantec C | 40 | 2.5\% | 2.5\% | 95.0\% | 3 | Imagination Technologies Group Plc | 44 | 0.0\% | 0.0\% | 100.0\% |
| 4 | Toyota Motor Corp | 35 | 2.9\% | 2.9\% | 94.3\% | 4 | Fortinet Inc | 41 | 0.0\% | 0.0\% | 100.0\% |
| 5 | Blackberry Ltd. | 31 | 6.5\% | 0.0\% | 93.5\% | 5 | A10 Networks Inc | 39 | 0.0\% | 0.0\% | 100.0\% |
| 6 | Halliburton Co. (Holding) | 28 | 7.1\% | 0.0\% | 92.9\% | 6 | Applovin | 36 | 0.0\% | 0.0\% | 100.0\% |
| 7 | eBay lnc | 37 | 5.4\% | 2.7\% | 91.9\% | 7 | ARC Devices Ltd | 33 | 0.0\% | 0.0\% | 100.0\% |
| 8 | HRLLaboratories LLC | 71 | 8.5\% | 0.0\% | 91.5\% | 8 | Broadband ITV Inc | 32 | 0.0\% | 0.0\% | 100.0\% |
| 9 | Splunk Inc | 53 | 7.5\% | 1.9\% | 90.6\% | 9 | Blinker Inc | 31 | 0.0\% | 0.0\% | 100.0\% |
| 10 | Mitsubishi Electric Corp | 41 | 9.8\% | 0.0\% | 90.2\% | 10 | BGC Partners Inc | 31 | 0.0\% | 0.0\% | 100.0\% |
| Communications |  |  |  |  |  | Cybersecurity |  |  |  |  |  |
| 1 | Parallel Wireless Inc | 100 | 0.0\% | 0.0\% | 100.0\% | 1 | Global Tel Link Corp | 79 | 0.0\% | 0.0\% | 100.0\% |
| 2 | Murata Manufacturing Co. Ltd. | 97 | 0.0\% | 0.0\% | 100.0\% | 2 | A10 Networks Inc | 62 | 0.0\% | 0.0\% | 100.0\% |
| 3 | MBITWIRELESS INC | 76 | 0.0\% | 0.0\% | 100.0\% | 3 | Xcelera Inc | 58 | 0.0\% | 0.0\% | 100.0\% |
| 4 | ISCO International Llc | 76 | 0.0\% | 0.0\% | 100.0\% | 4 | Sophos Ltd | 53 | 0.0\% | 0.0\% | 100.0\% |
| 5 | Nippon Telegraph \& Telephone Corp. | 68 | 0.0\% | 0.0\% | 100.0\% | 5 | ConvergeOne Inc | 50 | 0.0\% | 0.0\% | 100.0\% |
| 6 | CPG Technologies LIc | 58 | 0.0\% | 0.0\% | 100.0\% | 6 | Biocatch Ltd | 49 | 0.0\% | 0.0\% | 100.0\% |
| 7 | Starkey Labs Inc | 54 | 0.0\% | 0.0\% | 100.0\% | 7 | IBoss Inc | 48 | 0.0\% | 0.0\% | 100.0\% |
| 8 | Headwater Partners 1LL | 54 | 0.0\% | 0.0\% | 100.0\% | 8 | Sonos Inc | 47 | 0.0\% | 0.0\% | 100.0\% |
| 9 | Cohere Technologies Inc | 52 | 0.0\% | 0.0\% | 100.0\% | 9 | FedEx Corp | 47 | 0.0\% | 0.0\% | 100.0\% |
| 10 | Ubiquiti Networks Inc | 49 | 0.0\% | 0.0\% | 100.0\% | 10 | Digimarc Corp. | 45 | 0.0\% | 0.0\% | 100.0\% |
| Computer Hardware |  |  |  |  |  | Robotics and Intelligent Manufacturing |  |  |  |  |  |
| 1 | FedEx Corp | 61 | 0.0\% | 0.0\% | 100.0\% | 1 | ABB Ltd | 41 | 0.0\% | 0.0\% | 100.0\% |
| 2 | Xcelera Inc | 55 | 0.0\% | 0.0\% | 100.0\% | 2 | Johnson Controls International | 33 | 0.0\% | 0.0\% | 100.0\% |
| 3 | Dynamics Inc | 49 | 0.0\% | 0.0\% | 100.0\% | 3 | Sumitomo Heary Industries Ltd. | 30 | 0.0\% | 0.0\% | 100.0\% |
| 4 | STRONG FORCE IOT PORTFOLIO 2 | 47 | 0.0\% | 0.0\% | 100.0\% | 4 | Applied Materials Inc. | 54 | 3.7\% | 0.0\% | 96.3\% |
| 5 | Osterhout Design Group | 46 | 0.0\% | 0.0\% | 100.0\% | 5 | Walmart Stores Inc | 52 | 3.8\% | 0.0\% | 96.2\% |
| 6 | BIOCATCH LTD | 43 | 0.0\% | 0.0\% | 100.0\% | 6 | Halliburton Co. (Holding) | 39 | 5.1\% | 0.0\% | 94.9\% |
| 7 | Inphi Corp | 41 | 0.0\% | 0.0\% | 100.0\% | 7 | Brooks Automation Inc. | 31 | 6.5\% | 0.0\% | 93.5\% |
| 8 | Liqid lnc | 38 | 0.0\% | 0.0\% | 100.0\% | 8 | Softbank Corp | 65 | 9.2\% | 0.0\% | 90.8\% |
| 9 | Storagecraft Technology Corp | 36 | 0.0\% | 0.0\% | 100.0\% | 9 | Rockwell Automation Inc | 61 | 11.5\% | 0.0\% | 88.5\% |
| 10 | Rackspace Hosting Inc | 36 | 0.0\% | 0.0\% | 100.0\% | 10 | Globus Medical Inc | 25 | 12.0\% | 0.0\% | 88.0\% |
| Computer Peripherals |  |  |  |  |  | Semiconductors/Solid-State Devices |  |  |  |  |  |
| 1 | Manufacturing Resources Internationa | 53 | 0.0\% | 0.0\% | 100.0\% | 1 | China Electronics Corp | 67 | 0.0\% | 0.0\% | 100.0\% |
| 2 | Tactual Labs Co | 53 | 0.0\% | 0.0\% | 100.0\% | 2 | Avalanche Technology Inc | 62 | 0.0\% | 0.0\% | 100.0\% |
| 3 | P4TENTS1LLC | 46 | 0.0\% | 0.0\% | 100.0\% | 3 | Atomera Inc (Formerly Mears Techno | 55 | 0.0\% | 0.0\% | 100.0\% |
| 4 | Magna International Inc. | 40 | 0.0\% | 0.0\% | 100.0\% | 4 | Manufacturing Resources Internationa | 51 | 0.0\% | 0.0\% | 100.0\% |
| 5 | Micron Technology Inc. | 38 | 0.0\% | 0.0\% | 100.0\% | 5 | Toshiba Corp | 42 | 0.0\% | 0.0\% | 100.0\% |
| 6 | Osterhout Design Group | 37 | 0.0\% | 0.0\% | 100.0\% | 6 | Zeno Semiconductors Inc | 39 | 0.0\% | 0.0\% | 100.0\% |
| 7 | Ultrahaptics IP | 34 | 0.0\% | 0.0\% | 100.0\% | 7 | Deere \& Co. | 39 | 0.0\% | 0.0\% | 100.0\% |
| 8 | Koch Industries Inc | 34 | 0.0\% | 0.0\% | 100.0\% | 8 | HeartFlow Inc | 37 | 0.0\% | 0.0\% | 100.0\% |
| 9 | Sentons Inc | 34 | 0.0\% | 0.0\% | 100.0\% | 9 | Causam Energy Inc | 36 | 0.0\% | 0.0\% | 100.0\% |
| 10 | Commvault Systems Inc. | 30 | 0.0\% | 0.0\% | 100.0\% | 10 | Caterpillar Inc. | 35 | 0.0\% | 0.0\% | 100.0\% |

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In contrast, for the bottom 10 "large patenting entities (Figure 17)," men's patenting rates range from 64-96\%, with most being around the mid 70 s or 80 s.

FIGURE 17. Bottom 10 "Large Patenting Entities" with Women Inventorship 2016-20 (Organizations with 350+ Patents 2016-20; Highest \% of Men Only Patents)
U.S.-Invented U.S. Information Technology Patents

| Categ | Assignee | $\begin{gathered} \# \\ \text { Patents } \\ \text { 2016-20 } \end{gathered}$ | $\%$ <br> $\begin{array}{c}\% \\ \text { Mixed- } \\ \text { Gender }\end{array}$ <br> Teams | $\begin{gathered} \% \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{aligned} & \% \\ & \text { Men } \\ & \text { Monly } \end{aligned}$ | Categ | Assignee | $\begin{gathered} \# \\ \text { Patents } \\ \text { Pol6-20 } \end{gathered}$ |  | $\begin{gathered} \text { \% } \\ \text { Women } \\ \text { Only } \end{gathered}$ | $\begin{aligned} & \% \\ & \text { Men } \\ & \text { Mnly } \end{aligned}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Artificial Intelligence/Machine Learning |  |  |  |  |  | Computer Software |  |  |  |  |  |
| 1 | Alphabet Inc. | 578 | 19.0\% | 2.2\% | 78.7\% | 1 | Sony Corp | 424 | 7.1\% | 2.1\% | 90.8\% |
| 2 | International Business Mach | 1381 | 30.3\% | 4.5\% | 65.2\% | 2 | Walmart Stores Inc | 517 | 10.1\% | 3.1\% | 86.8\% |
| 3 | Microsoft Corporation | 515 | 34.0\% | 2.3\% | 63.7\% | 3 | Apple Inc | 1084 | 15.3\% | 1.3\% | 83.4\% |
| 4 |  |  |  |  |  | 4 | Boeing Co. (The) | 506 | 16.8\% | 1.6\% | 81.6\% |
| 5 |  |  |  |  |  | 5 | SalesforceCom Inc | 466 | 15.0\% | 3.9\% | 81.1\% |
| 6 |  |  |  |  |  | 6 | Cisco Systems Inc. | 554 | 16.2\% | 2.9\% | 80.9\% |
| 7 |  |  |  |  |  | 7 | Adobe Inc. | 631 | 17.3\% | 1.9\% | 80.8\% |
| 8 |  |  |  |  |  | 8 | Dell Technologies Inc | 1073 | 14.9\% | 4.5\% | 80.6\% |
| 9 |  |  |  |  |  | 9 | Amazon.com Inc. | 3121 | 18.3\% | 1.3\% | 80.3\% |
| 10 |  |  |  |  |  | 10 | Siemens Aktiengesellschaft | 549 | 18.8\% | 3.1\% | 78.1\% |
| Communications |  |  |  |  |  | Cybersecurity |  |  |  |  |  |
| 1 | Charter Communications Inc | 354 | 5.9\% | 1.1\% | 92.9\% | 1 | Norton Lifelock (formerly Sy | 504 | 6.7\% | 3.4\% | 89.9\% |
| 2 | Comcast Corp | 494 | 6.5\% | 1.6\% | 91.9\% | 2 | Amazon.com Inc. | 1519 | 10.7\% | 0.6\% | 88.7\% |
| 3 | Sony Corp | 456 | 7.5\% | 0.9\% | 91.7\% | 3 | Oracle Corporation | 451 | 11.1\% | 1.1\% | 87.8\% |
| 4 | Maxlinear Inc | 380 | 8.2\% | 0.5\% | 91.3\% | 4 | T-Mobile | 375 | 13.9\% | 1.6\% | 84.5\% |
| 5 | CenturyLinkInc | 471 | 8.5\% | 1.9\% | 89.6\% | 5 | Dell Technologies Inc | 1389 | 14.0\% | 2.2\% | 83.7\% |
| 6 | Amazon.com Inc. | 1560 | 8.9\% | 1.6\% | 89.5\% | 6 | Cisco Systems Inc. | 778 | 12.2\% | 5.8\% | 82.0\% |
| 7 | Marvell Technology Group L | 758 | 9.2\% | 2.5\% | 88.3\% | 7 | Intel Corporation | 1540 | 16.5\% | 1.7\% | 81.8\% |
| 8 | Samsung Electronics Co Ltd | 874 | 8.9\% | 2.9\% | 88.2\% | 8 | Apple Inc | 734 | 18.0\% | 0.7\% | 81.3\% |
| 9 | Ericsson | 760 | 10.9\% | 1.1\% | 88.0\% | 9 | Alphabet Inc. | 1127 | 18.3\% | 1.6\% | 80.1\% |
| 10 | Texas Instruments Inc | 841 | 9.6\% | 2.5\% | 87.9\% | 10 | AT\&T Inc | 895 | 17.2\% | 3.7\% | 79.1\% |
| Computer Hardware |  |  |  |  |  | Robotics and Intelligent Manufacturing |  |  |  |  |  |
| 1 | PURE Storage Inc | 456 | 7.0\% | 0.2\% | 92.8\% | 1 | None with 350+ Patents |  |  |  |  |
| 2 | Micron Technology Inc. | 2059 | 5.1\% | 3.7\% | 91.1\% | 2 |  |  |  |  |  |
| 3 | Rambus Inc. | 523 | 8.4\% | 0.6\% | 91.0\% | 3 |  |  |  |  |  |
| 4 | Norton Lifelock (formerly Sy | 395 | 6.3\% | 2.8\% | 90.9\% | 4 |  |  |  |  |  |
| 5 | Honeywell International Inc. | 624 | 7.5\% | 1.9\% | 90.5\% | 5 |  |  |  |  |  |
| 6 | Commvault Systems Inc. | 367 | 10.6\% | 0.0\% | 89.4\% | 6 |  |  |  |  |  |
| 7 | Texas Instruments Inc | 423 | 9.7\% | 2.6\% | 877\% | 7 |  |  |  |  |  |
| 8 | Marvell Technology Group L | 517 | 10.4\% | 2.7\% | 86.8\% | 8 |  |  |  |  |  |
| 9 | NVIDIA Corp. | 519 | 12.9\% | 0.8\% | 86.3\% | 9 |  |  |  |  |  |
| 10 | Amazon.com Inc. | 3183 | 12.8\% | 1.4\% | 85.8\% | 10 |  |  |  |  |  |
| Computer Peripherals |  |  |  |  |  | Semiconductors/Solid-State Devices |  |  |  |  |  |
| 1 | Sony Corp | 350 | 4.9\% | 2.0\% | 93.1\% | 1 | On Semiconductor Corporat | 578 | 3.8\% | 0.7\% | 95.5\% |
| 2 | Synaptics Inc. | 372 | 11.3\% | 2.4\% | 86.3\% | 2 | Qorvo | 376 | 4.5\% | 0.5\% | 94.9\% |
| 3 | Seagate Technology Plc | 861 | 13.7\% | 0.8\% | 85.5\% | 3 | Dell Technologies Inc | 542 | 4.1\% | 1.3\% | 94.6\% |
| 4 | Sonos Inc | 411 | 11.9\% | 3.2\% | 84.9\% | 4 | Eaton Corp. | 357 | 5.3\% | 0.8\% | 93.8\% |
| 5 | Dell Technologies Inc | 661 | 13.0\% | 2.3\% | 84.7\% | 5 | Infineon Technologies AG | 513 | 5.8\% | 0.6\% | 93.6\% |
| 6 | HP Inc | 944 | 17.3\% | 3.3\% | 79.4\% | 6 | Xperi Holding Corporation (F) | 500 | 9.0\% | 0.2\% | 90.8\% |
| 7 | Alphabet Inc. | 1576 | 20.3\% | 1.8\% | 77.9\% | 7 | Raytheon Co . | 677 | 11.4\% | 1.0\% | 87.6\% |
| 8 | Amazon.com Inc. | 929 | 20.3\% | 1.9\% | 777\% | 8 | Samsung Electronics Co Ltd | 368 | 10.1\% | 2.7\% | 87.2\% |
| 9 | Xerox Corp | 474 | 20.7\% | 1.9\% | 77.4\% | 9 | Western Digital Corp. | 735 | 11.0\% | 1.9\% | 87.1\% |
| 10 | Western Digital Corp. | 611 | 23.2\% | 0.7\% | 76.1\% | 10 | Micron Technology Inc. | 1826 | 11.9\% | 2.4\% | 85.7\% |

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Some companies have also produced large increases in women's rates of patenting in the past five years since the original study ranging from a $17 \%$ decrease in men's patenting to a $48 \%$ decrease. And likewise, a number of companies have seen a range of decreases in women's patenting, with men's rate of patenting up by anywhere from 3\% to $23 \%$.

These findings also raise additional questions for future research. For example, as noted earlier, many questions remain regarding the relationship between team size and increased citation rates. Better understanding this relationship is important for understanding this phenomenon. In addition, the patenting data alone tells us little about the reasons for the dramatic differences across organizations. As a result, future research would do well to explore how the demographic makeup and size of a company influences their women's patenting rates. For example, do companies with higher women's patenting rates also employ larger numbers of women? What other characteristics, if any, do higher women-patenting companies share? Do specific organizational practices and conditions contribute to women's higher patenting rates and if so, in what ways? This additional research is necessary to understand the reasons for the existing variance across companies. The fact that these differences exist, however, does suggest that specific contexts do make a difference and that there is no industry-wide systemic reason for the low level of women's patenting overall.


## RESULTS BY SECTOR

Figure 18 shows U.S. patent activity by sector for two time periods (1980-1984 and 2016-2020). We see that in the most recent period U.S. firms obtained about $81.9 \%$ of IT patents, which is up from 69.3\% in the prior period. In the same period, individual inventors have dropped by about $8 \%$ and U.S. Government agency patenting has dropped by $5 \%$. It is not clear why there are fewer patents by individuals, although perhaps rising costs of obtaining patents may have something to do with it. The government agency reduction in patenting is a function of the Bayh-Dole Act, which was enacted in 1980, but started to affect patent ownership in the late 1980's. The biggest impact of the Bayh-Dole Act is the presumption of ownership of a patent funded by the government. For example, the California Institute of Technology (CalTech) operates NASA's Jet Propulsion Lab. Prior to the Bayh-Dole Act, any patent produced by the lab would be assigned to NASA. Under the current law, the patent would be assigned to CalTech with a royalty-free license going to NASA. Similarly, Rand Corp runs several federally funded research centers for the Department of Defense and Department of Energy, so patents that would have been assigned to those agencies in the early time-period are now assigned to Rand.

FIGURE 18. U.S.-Invented Information Technology Patenting by Sector for Two Time Periods


Figure 19 and Figure 20 show the percentage of U.S. Information Technology patents invented by women by sector and technology category. If we look at the overall combined category, we see that U.S. universities have the highest percentage of women inventorship in each time-period. For 2016-20 12.25\% of U.S.-invented IT patents from universities were invented by women, compared to 8.91\% for women in U.S. firms and 9.0\% for women in foreign-owned firms with U.S. operations.

FIGURE 19. Percentage of Women U.S.-Invented Patents by Sector and Technology Category (Patents 1980-2020 - Sectors with Fewer than 50 Patents Omitted)


Artificial Intelligence/Machine Learning


## Communications



FIGURE 20. Percentage of Women U.S.-Invented Patents by Sector and Technology Category (Patents 1980-2020 - Sectors with Fewer than 50 Patents Omitted)


## IV. Conclusion

The National Center for Women \& Information Technology, with funding from its Workforce Alliance, commissioned this study to provide insight into the current state of affairs regarding the rate and progress of women's patenting. The bad news is that the overall rate of patenting by women in IT is still relatively low in the U.S. The good news is that the trends are positive with a growing share of women inventorship in a fast-growing field. The news is even better in some subcategories of IT such as Artificial Intelligence and Software.

Likewise, the finding that mixed-gender teams are more frequently cited than either men-only or women-only teams is still an interesting finding. While this advantage seems primarily related to size of team, future research would do well to explore the relationship between size, gender, and citation rates.

Additional good news emerges in the finding that the level of women inventorship in IT is quite high at some companies. This suggests that systemic factors, such as company environment, can make a difference. As such, women could continue to gain greater shares of IT invention, especially if we identify and replicate the conditions and practices that foster women's increased patenting efforts. This report then serves as a call for additional research to identify the conditions and practices that would make this possible.


women
INFORMATION TECHNOLOGY

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[^0]:    ${ }^{2}$ A. Breitzman and F. Narin, U.S. 6175824: Method and apparatus for choosing a stock portfolio, based on patent indicators (Patent Application U.S.1999/353613, 14 July 1999).
    P. Thomas, A relationship between research indicators and financial performance. In: 6th International Conference on Science and Technology Indicators, Leiden, The Netherlands, 24-27 May 2000
    F. Narin, E. Noma, R. Perry, Patents as indicators of corporate technological strength, Research Policy, Volume 16, Issues 2-4, August 1987, Pages 143-155
    ${ }^{3}$ Remember that communication patents will have different expected counts depending on age of patents, so we add these different expected citation counts for different ages to get the average expected citation count for all communication patents. We then divide the total number of citations for men-invented patents by this overall expected citation count. This process is repeated for women and mixed-gender invented patents).

