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## Prizes and Productivity: How Winning the Fields Medal Affects Scientific Output

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# Prizes and Productivity <br> How Winning the Fields Medal Affects Scientific Output 

George J. Borjas<br>Kirk B. Doran


#### Abstract

Knowledge generation is key to economic growth, and scientific prizes are designed to encourage it. But how does winning a prestigious prize affect future output? We compare the productivity of Fields Medal recipients (winners of the top mathematics prize) to that of similarly brilliant contenders. The two groups have similar publication rates until the award year, after which the winners' productivity declines. The medalists begin to "play the field," studying unfamiliar topics at the expense of writing papers. It appears that tournaments can have large postprize effects on the effort allocation of knowledge producers.


"I look forward to proving more theorems. I hope the weight of this prize doesn't slow me down."
-Stanislav Smirnov, Fields Medal recipient, 2010

## I. Introduction

The production of knowledge is central to long-term economic growth. Yet little is known about how knowledge is produced, making it difficult to predict which types of incentives are most effective in eliciting effort from knowledge produc-

[^0]ers. Prizes are a common incentive for knowledge production; hundreds of scientific prizes are awarded throughout the world and across all scientific disciplines. Although these prizes are frequently awarded with the explicit goal of inspiring more and better scientific work (Scotchmer 2006), a question remains: Are they effective?

A voluminous theoretical and empirical literature examines how the presence of potential future rewards (whether a promotion to CEO or winning a golf tournament) elicits optimal efforts from the tournament participants in their effort to win the contest. ${ }^{1}$ This literature emphasizes the incentive effects of the prize prior to the completion of the tournament. But what happens to the productivity of tournament winners after they win the prize? ${ }^{2}$ Standard models of labor supply suggest that the postprize impact of a big win could be significant, especially when the award is granted at a young age.

This paper examines the impact of winning the Fields Medal on the postmedal productivity and research choices of mathematicians. ${ }^{3}$ The Fields Medal is the most prestigious award in all of mathematics, awarded every four years to mathematicians under the age of 40 . Established by the Canadian mathematician John Charles Fields, the medal is often thought of as the "Nobel Prize of Mathematics." ${ }^{3}$ Inspired by the desire to promote mathematical cooperation and research around the world, Fields used his position as Chairman of the Organization Committee of the International Mathematical Congress to bring his idea to fruition. In a memo appended to the January 12, 1932 minutes of the Committee of the International Congress at Toronto, Fields described his vision:
> "It is proposed to found two gold medals to be awarded at successive International Mathematical Congresses for outstanding achievements in mathematics. Because of the multiplicity of the branches of mathematics and taking into account the fact that the interval between such congresses is four years it is felt that at least two medals should be available." (Tropp 1976, p. 173)

In the same document, Fields explained the motivation for the award: "While [the medal] was in recognition of work already done it was at the same time intended to be an encouragement for further achievement on the part of the recipients and a stimulus to renewed effort on the part of others" (emphasis added). In other words, not only

[^1]would the existence of the prize solicit effort from the participants in this elite tournament, it would also encourage additional (that is, postmedal) effort on the part of the winners.

Using administrative data from the American Mathematical Society (AMS) and the Mathematics Genealogy Project (MGP), we examine the shape of the age-productivity profile of these exceptional mathematicians along a number of dimensions, including the number of papers published, citations received, and students mentored. Our empirical analysis exploits the fact that only a subset of the great mathematical contributions in the past 80 years resulted in Fields Medals, and that this subset was partly determined by arbitrary factors such as the quadrennial timing of the award, the age restriction, and subject-level biases.

Our main set of results uses the set of winners from a broader set of prizes for great mathematical achievement (awards that are themselves good predictors of winning the Fields Medal) to construct a representative group of brilliant mathematicians who can be thought of as "contenders" for the medal. Our analysis compares the research output of the medalists with that of the losing contenders. The age-productivity profile of the two groups is similar until a particular mathematician wins the Fields Medal (or does not win it). Remarkably, the productivity of the Fields Medal recipients declines noticeably relative to that of the contenders in the postmedal period, regardless of whether we measure productivity in terms of papers published, citations received, or students mentored.

The award of a Fields Medal enhances a mathematician's professional reputation far more than any other potential event in the mathematics profession. Although the prize money is itself negligible, the medal certainly can lead to a substantial increase in "wealth" (both in terms of dollars and in intangible measures of academic prestige) if the mathematician chooses to leverage the award in the marketplace. The neoclassical labor-leisure model predicts that the expansion in the opportunity set should induce the medalists to consume more leisure in the postmedal period. Moreover, the wealth effect can also lead to a shift in the research strategy pursued by the Fields Medal recipients: They are now free to "play the field" and pursue topics in different areas of mathematics (or even outside mathematics) that they may find interesting or worthwhile and that have a high consumption value.

We employ the notion of "cognitive mobility" (Borjas and Doran 2015) to capture the transition in the space of ideas as knowledge producers move from one research topic to another over the course of a career. The AMS data classifies each published paper into one of 73 specific and narrow mathematical fields. It turns out that there is a crucial link between a mathematician's propensity for cognitive mobility across mathematical fields and the awarding of a Fields Medal. Specifically, while medalists and contenders have similar cognitive mobility rates initially, the medalists exhibit a far greater rate of mobility in the postmedal period. Because cognitive mobility is costly (for example, additional time is required to prepare a paper in an unfamiliar field), the increased rate of cognitive mobility reduces the medalists' rate of output in the postmedal period. The data suggest that about half of the decreased rate of output is due to the increased propensity for "trying out" unfamiliar fields, often outside pure mathematics.

Every four years, the greatest mathematicians in the world gather to select and honor new medalists and to remind them that the Fields Medal is meant to encourage
their future achievement. In fact, the medal reduces the rate of publication and the likelihood that its winners produce great achievements in pure mathematics. At least in this context, it seems that the net productivity impact of selecting winners on the basis of a tournament depends crucially on what happens as the winners adjust their behavior to take advantage of the postprize expansion in the opportunity set.

## II. Historical Background

The first Fields Medals were awarded soon after Fields' 1932 memo. The medals are traditionally awarded during the opening ceremony of the quadrennial International Congress of Mathematicians (ICM). In 1936, the medals were awarded to two mathematicians. Because of World War II, the medals were not awarded again until 1950, when they were again given to two mathematicians. Since 1950, the Fields Medal has been awarded quadrennially, to two, three, or four mathematicians in each cycle.

The initial moneys available to fund the medals were the result of an accidental surplus of funds left over after the 1924 ICM. These funds, accompanied by the bequest of Fields himself, allowed for the granting of two medals. In 1966, an anonymous donor made additional funds available allowing four medals to be awarded in each of the next two cycles (ICM 1966). As a result, the number of Fields Medals awarded in any given four-year cycle was not mainly determined by how many mathematicians had made fundamental advances in the relevant time period. Instead, the number often depended on how much income had accumulated in the Fields Medal account, on the availability of private anonymous donors, and on an upper limit of (initially) two or (later) four medals to be awarded by any particular Congress (ICM 2006).

As noted earlier, the Fields Medals were designed partly to promote future mathematical achievement on the part of the recipients. This goal is sufficiently important that it has been repeated verbatim and expounded upon at nearly every award ceremony. For example, in the 1954 Congress, eminent mathematician Hermann Weyl spoke movingly to the winners: "The mathematical community is proud of the work you both have done. It shows that the old gnarled tree of mathematics is still full of sap and life. Carry on as you began!"

From its inception, the committees have interpreted Fields' desire for future encouragement to mean that the medal should be awarded to mathematicians who are "young" (ICM 1936), and the word "young" has consistently been interpreted to mean that the medal may only be awarded to mathematicians under the age of 40 (ICM various issues). ${ }^{5}$ Most recently, the 2006 committee explicitly stated its requirement that a mathematician qualifies for the Fields Medal only if he has not yet turned 40 as of January 1 of the year in which the Congress meets (ICM 2006).

The restrictions on the number and age distribution of the Fields Medal recipients introduce arbitrary variation in which subset of great mathematicians of the past 80 years received the award and which did not. As a result, many mathematicians who

[^2]are widely perceived as "great architects of twentieth-century mathematics," even for work done at an early age, did not receive the Fields Medal (Tropp 1976). There are numerous such examples. The American Mathematical Society said of mathematician George Lusztig: "[His work] has entirely reshaped representation theory and in the process changed much of mathematics" (AMS 2008, p. 489). Although "Lusztig's exceptional mathematical ability became evident at an early stage of his career," and "it can be no exaggeration to say that George Lusztig is one of the great mathematicians of our time," he did not receive the Fields Medal (Carter 2006, pp. 2, 42).

Similarly, the Norwegian Academy of Science and Letters (Solholm 2010) cited John Tate for "his vast and lasting impact on the theory of numbers," claiming that "many of the major lines of research in algebraic number theory and arithmetic geometry are only possible because of [his] incisive contributions and illuminating insights." Nevertheless, Tate also did not receive a Fields Medal.

In fact, considering the number of mathematicians who are regularly lauded by the various National Academies of Sciences and Mathematical Societies for (re)inventing new subfields of mathematics, it is clear that the 52 Fields Medals that have been awarded (as of 2013) are insufficient to cover even half of all the great achievements that have made modern mathematics possible. Hence, it should not be particularly surprising that Robert Langlands, a mathematician whose work specifically inspired and made possible the contributions of at least two Fields Medal recipients (Laurent Lafforgue and Ngô Bảo Châu), and who founded the most influential program connecting number theory and representation theory, did not receive the Fields Medal himself.

Historians of the Fields Medal have also documented the "bias" that causes some fields and styles of mathematics to be better represented among winners (Monastyrsky 2001). For example, Langlands (1985, p. 212) wrote of mathematician Harish-Chandra: "He was considered for the Fields Medal in 1958, but a forceful member of the selection committee in whose eyes Thom [one of the two Fields Medal recipients that year] was a Bourbakist was determined not to have two. So Harish-Chandra, whom he also placed on the Bourbaki camp, was set aside." ${ }^{6}$

Similarly, the arbitrary age cutoff and the four-year periodicity of the award work together to exclude mathematicians who obviously should have received the medal. The New York Times obituary of Oded Schramm states: "If Dr. Schramm had been born three weeks and a day later, he would almost certainly have been one of the winners of the Fields Medal . . . But the Fields Medals, which honor groundbreaking work by young mathematicians, are awarded only once every four years and only to mathematicians who are 40 or under. Dr. Schramm was born on Dec. 10, 1961; the cutoff birth date for the 2002 Fields was Jan. 1, 1962. Wendelin Werner, a younger mathematician who collaborated with Dr. Schramm on follow-up research, won a Fields in 2006" (Chang 2008).

In short, while it is tempting to claim that the 52 Fields Medal recipients are in a class by themselves, and that there are no losing contenders with equivalent or better early achievements, this view does not correspond with what mathematicians themselves

[^3]have written. As the ICM noted: "We must bear in mind how clearly hindsight shows that past recipients of the Fields' medal were only a selection from a much larger group of mathematicians whose impact on mathematics was at least as great as that of the chosen" (ICM 1994). The arbitrariness in the number, timing, and field distribution of Fields Medal recipients means that a similarly great group of "contenders" should exist that can be contrasted with the winners in a difference-in-differences strategy to determine how winning the medal influences productivity and research choices.

## III. Data

To measure the lifecycle productivity of elite mathematicians, we use the comprehensive data contained in the AMS MathSciNet archives. The AMS provided us with a database that reports the number of papers published by every mathematician in the world, by field and year, since 1939. The AMS professional staff assigns each publication in mathematics to one of the many fields that make up the discipline (and this information will prove useful below). Our database contains the author-year-field information at the two-digit field level, classifying every publication over the 1939-2011 period into one of 73 different fields. The database also contains information on the number of citations received by the papers. It is important to note, however, that the AMS citation data is incomplete. In particular, it only counts citations in a limited number of journals (which include the most important journals in mathematics), and only reports the post-2000 citations received by a paper (regardless of when the paper was published).

We wish to determine what the postmedal career path of Fields Medal recipients would have looked like had they not been awarded the medal. Because of the capricious events affecting the selection of the subset of great mathematicians who received the medal, we conjecture that there should exist a comparison group of mathematicians who did similarly path-breaking work before the age of 40 but who did not receive the medal and can serve as a control group. ${ }^{7}$

We use a systematic and easily replicable method for constructing the set of "contenders." ${ }^{8}$ Specifically, our construction of the control group starts out by including

[^4]the winners of six other major mathematical awards with roughly similar goals as the Fields Medal. It turns out that winning any one of these prizes is a good predictor for receiving a Fields Medal.

First, we consider the two most prestigious general mathematics prizes (after the Fields Medal), which tend to be given closer to the end of a mathematician's career. Both the Abel Prize and the Wolf Prize cover the entire breadth of the mathematics discipline and are only given to mathematicians who have made extraordinary contributions. The Abel Prize, which has a significantly higher monetary value than the Fields Medal (nearly $\$ 1$ million versus $\$ 15,000$ ), began to be awarded in 2003 to one or two mathematicians a year. ${ }^{9}$ The Wolf Prize has been awarded annually since 1978, typically to two mathematicians (although no prize has been awarded in some years). Any mathematician who won either of these prestigious awards (and did not win the Fields Medal) is clearly a key formulator of modern mathematics and automatically becomes part of our group of potential contenders.

In addition to these two general prizes, there are a number of prestigious areaspecific prizes in mathematics. Specifically, we consider the four most prestigious area-specific awards for: algebra (the Cole Prize of the AMS); analysis (the Bôcher Prize of the AMS); geometry (the Veblen Prize of the AMS); and the study of Fourier series (the Salem Prize). We add into our group of potential contenders any mathematicians who won one of these four area prizes before the age of 40 (and did not win the Fields Medal). ${ }^{10}$

This algorithm yields the names of 92 potential contenders who contributed significantly to at least one of the key subject areas of mathematics or to mathematics as a whole but who did not receive the Fields Medal. There is a very strong correlation between winning any of these prizes and winning the Fields Medal: 52 percent of the Fields Medal recipients also won at least one of these prestigious awards. The predictive power of each prize is as follows: Five out of the 13 Abel Prize winners also won the Fields, as did 13 out of the 54 Wolf Prize winners, three out of the 26 Cole Prize winners, four out of the 32 Bôcher Prize winners, four out of the 29 Veblen Prize winners, and seven out of the 48 Salem Prize winners.

Our empirical strategy requires us to determine if a mathematician is eligible for the Fields Medal in any particular cycle so that we need to observe the mathematician's date of birth. Although the AMS data does not provide this information, we ascertained the birth date (through Internet searches for each mathematician's curriculum vitae or personal contact) for all Fields Medal recipients and for almost all of the potential contenders. The systematic archival of publications by MathSciNet started in 1939, and some mathematicians in our sample published in their teenage years, so we restrict the study to those born in or after 1920. Further, we exclude the six potential contenders for whom we could not confirm a date of birth. This leaves us with a sample of 47 medalists and 86 potential contenders. The appendix presents the

[^5]combined list of all winners, a list that includes all the mathematicians mentioned in our historical survey.

There is obviously a great deal of variation in the mathematical significance and timing of the work of the potential contenders. For example, the narrowness of the area prizes suggests that the contribution of some of these winners, although very important in that particular area, may not have the "breadth" required to generate sufficient interest in the broader community of mathematicians. Similarly, some of the contenders (who perhaps went on to win one of the general prizes) may have produced their best work after their eligibility for the Fields Medal ended. Hence, we whittle down the list of 86 potential contenders by examining how often other mathematicians cite the work that the contenders produced during the years they were eligible for the Fields Medal.

A recipient of the Fields Medal cannot have turned 40 after January 1 of the year in which the medal is awarded. For example, the 2010 medal cycle would have been the last cycle for a person born anytime between January 1, 1970, and December 31, 1973. Even though the contenders born in this time frame did not win in their last shot at the medal, the incentives for "impressing" the Fields Medal committee ended in 2010. Hence, we assign the year 2010 as the "medal year" for these contenders to separate the pre- and postmedal periods. We used a similar exercise to ascertain the medal year for all the contenders in our sample. A mathematician's eligibility period is then given by the years between the mathematician's first publication and the medal year.

We calculate the annual rate of citations generated by a potential contender during his eligibility period by dividing the total number of citations received by papers published in this period (cumulative as of October 2011) by the number of years in the eligibility period. We then define the final set of contenders as the 43 mathematicians in this group whose annual eligibility-period citation rate is above the median. In other words, our final group of contenders represents "la crème de la crème" of mathematicians who did widely recognized work during the eligibility period and who did not win the Fields Medal. ${ }^{11}$

Table 1 reports summary statistics for the sample of Fields Medal recipients as well as for the control group (using both the final list of contenders with above-median citations as well as the group of all 86 prize winners). ${ }^{12}$ The table also reports comparable statistics (when available) for a sample of "professional mathematicians," which we define as the group of mathematicians in the AMS archive whose first and last published papers span at least a 20 -year period.

Obviously, both the Fields Medal recipients and the contenders publish much more and receive many more citations than the average mathematician. There is, however, relatively little difference in measured productivity between the final group of con-

[^6]Table 1
Summary Statistics

|  | Variable |  |  |  |
| :--- | :---: | :---: | :---: | ---: |
|  | All Mathematicians | Fields Medal <br> Recipients | Contenders with <br> Above-Median Citations | All Contenders |
| Lifetime papers | 31.8 | 116.5 | 126.4 | 106.4 |
| Papers per year | 0.9 | 3.1 | 3.6 | 2.7 |
| 20-39 years old | - | 3.3 | 3.4 | 2.7 |
| 40-59 years old | - | 2.9 | 4.1 | 3.0 |
| Lifetime citations | 93.6 | $2,451.9$ | $2,213.5$ | $1,640.4$ |
| Citations per year | 2.5 | 64.0 | 39.1 |  |
| Citations per paper | 1.8 | 21.0 | 17.5 | 15.6 |
| Year of birth | - | $1,949.5$ | $1,953.7$ | $1,946.2$ |
| Year of first publication | - | $1,972.6$ | $1,977.7$ | 24.9 .8 |
| Age at first publication | - | 23.1 | 24.0 | 14.0 |
| Deceased (percent) | - | 74.0 | 60.5 | 20.9 |
| Age at death | 72,140 | 47 | 43 | 66.3 |
| Number of mathematicians |  |  | 86 |  |

Notes: The summary statistics for "all mathematicians" are calculated using the group of mathematicians in the AMS database who had at least 20 years of experience before ending their publication career, in other words, those whose most recent publication is at least 20 years after their first publication. The group of "contenders" is composed of persons who were awarded at least one of six other mathematics prizes (the Abel, Wolf, Cole Algebra, Bôcher, Veblen, and Salem Prizes) but were not awarded the Fields Medal. The group of contenders with "above-median citations" is composed of the contenders who had above-median per-year citations during the eligibility period for the Fields Medal. The years included in the "Papers per year" calculations across different age groups begin with the year of the first publication and end at age 59 or the year of death (whichever comes first).
tenders and the Fields Medal recipients. The medalists published 3.1 papers per year during their career, as compared to 3.6 papers for the contenders. The typical paper published by a medalist received 21 citations, as compared to 17.5 citations for the contenders. The average mathematician in both groups was born around 1950, and they each published their first paper at the early age of 23 or 24.

The table also summarizes the rate of output by age, calculating the average number of papers published annually by the medalists and the contenders between the ages of 20-39 and 40-59. The data reveal suggestive differences. The medalists and the contenders published essentially the same number of papers per year in the early part of the career ( 3.4 papers), but the medalists published 1.2 fewer papers per year after age 40 . This striking pattern presages the nature of the empirical evidence that will be documented in subsequent sections.

## IV. The Fields Medal and the Age-Productivity Profile

As noted earlier, despite the plethora of important prizes that a brilliant mathematician can potentially receive, the prestige of the Fields Medal is substantially greater than that of any other prize. In fact, the ICM Fields Medal announcement emphasizes that the prestige effect is far greater than the accompanying monetary award: "The Fields Medals carry the highest prestige of all awards in mathematics. This prestige does not derive from the value of the cash award but from the superb mathematical qualities of the previous Fields Medal awardees" (ICM 2010).

Nevertheless, it is obvious that the financial impact of the Fields Medal on a mathematician's lifetime wealth is not limited to the $\$ 15,000$ monetary prize. Fields Medal recipients are likely to see a substantial expansion in their opportunity set in terms of high-quality job offers, additional research funding, and many other career opportunities. It is conceivable, therefore, that the wealth effect (which includes money as well as the additional opportunities allowed by the substantial increase in professional prestige) could be sizable and could alter the medalist's postmedal behavior. ${ }^{13}$

The neoclassical labor-leisure model suggests that the wealth effect should increase the consumption of leisure by the Fields Medal recipients relative to that of the contenders. As a result, we should not be surprised if the "weight of the prize" does indeed slow the Fields Medal recipients down. Moreover, the wealth effect might influence the mathematician's choice of research topics, either because the mathematician can now afford to explore topics that are essentially "consumption goods" or because the

[^7]

Figure 1
Average number of papers published annually by the Fields Medal recipients and the contenders (three-year moving average)
Notes: The group of "contenders" is composed of persons who were awarded at least one of six other mathematics prizes (the Abel, Wolf, Cole Algebra, Bôcher, Veblen, and Salem Prizes) and have abovemedian per-year citations during the eligibility period for the Fields Medal, but were not awarded the Fields Medal. We smooth out the trend by using a three-year moving average centered on the middle year in the interval.
medalist feels that he can pursue "riskier" topics. These shifts in research interests, discussed in more detail below, also have productivity consequences. ${ }^{14}$

We initially measure the productivity of the elite mathematicians by the number of papers published in each year. Figure 1 illustrates the lifecycle trend in the average number of papers published by both the medalists and the control group composed of

[^8]the subset of contenders who have above-median citations in the eligibility period. Specifically, the figure plots the average number of papers published per year by the medalists and the contenders at the prime of their career relative to the medal year. The Fields Medal recipients are plotted relative to the year they actually received the medal (a zero on the $x$-axis represents the year of the prize); the contenders are plotted relative to the last year of their eligibility for the medal (a zero on the $x$-axis represents the last year of their eligibility).

It is evident that the medalists and the contenders had very similar age-productivity profiles during the eligibility period, publishing around three to four papers per year. The figure also shows, however, a dramatic drop in the annual rate of output for the medalists that coincides with their receipt of the Fields Medal. A decade or two after receipt of the Fields Medal, the average medalist published around 1.5 fewer papers per year than the average contender. ${ }^{15}$

Of course, these differences could be due to factors that cannot be controlled for by the graphical analysis, including individual fixed effects, calendar-year effects, and age differences. We stack the annual data in our panel of medalists and contenders, and estimate the regression model:

$$
\begin{equation*}
y_{i t}=\delta_{i}+\delta_{t}+\alpha T_{i}+\beta\left(T_{i} \times F_{i}\right)+Z_{i} \gamma+\varepsilon, \tag{1}
\end{equation*}
$$

where $y_{i t}$ gives the number of papers published by mathematician $i$ in calendar year $t ; \delta_{i}$ and $\delta_{t}$ are vectors of individual and calendar-year fixed effects, respectively; $T$ is a dummy variable indicating if the observation refers to the postmedal period; $F$ is a dummy variable indicating if mathematician $i$ won the Fields Medal; and $Z$ is a set of background characteristics that includes the mathematician's age (introduced as a fourth-order polynomial). The data panel contains one observation for each mathematician for each year between the year of the first publication and the most recent year of potential activity (if alive) or the year of death. The coefficient $\alpha$ measures the difference in the annual rate of publication between the post- and premedal periods for the contenders, while the coefficient $\beta$ measures the relative change in this gap for the Fields Medal recipients.

Table 2 reports the estimated coefficients using a variety of alternative specifications. The first two columns report coefficients when the control group is formed by the sample of contenders with above-median citations in the eligibility period. Row 1 reports the simplest regression model. The estimate of $\alpha$ is small, suggesting no substantial difference in the average annual product of the contenders in the pre- and

[^9]Table 2
Impact of the Fields Medal on the Number of Papers Published Per Year

| Specification | Sample of Contenders |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Contenders with AboveMedian Citations |  | All Contenders |  |
|  | Postmedal Period | Postmedal Period <br> $\times$ Fields Medal | Postmedal Period | Postmedal Period <br> $\times$ Fields Medal |
| Number of papers | 0.119 | -1.378 | -0.157 | -0.918 |
|  | (0.548) | (0.676) | (0.291) | (0.435) |
| Log number of papers | -0.074 | -0.244 | -0.093 | -0.173 |
|  | (0.089) | (0.105) | (0.065) | (0.090) |
| Papers, quantile regression | -0.421 | -0.665 | -0.314 | -0.756 |
|  | (0.283) | (0.256) | (0.150) | (0.161) |
| Number of papers: |  |  |  |  |
| Contenders' postmedal period begins at age 36 | 0.160 | -1.395 | -0.166 | -0.914 |
|  | (0.494) | (0.656) | (0.279) | (0.435) |
| Contenders' postmedal period begins at age 40 | 0.266 | -1.440 | 0.069 | -0.987 |
|  | (0.545) | (0.681) | (0.286) | (0.436) |

Notes: Standard errors are reported in parentheses and are clustered at the individual level. The regressions using the sample of contenders with above-median citations have 3,269 observations ( 2,719 observations in the log papers regressions); the regressions using the sample of all contenders have 5,213 observations (4,109 observations in the $\log$ papers regressions). In Rows $1-3$, the contenders' postmedal period begins the year they are no longer eligible to receive the Fields Medal.
postmedal periods (after controlling for age and period effects). The estimate of $\beta$ is negative and around -1.4 , indicating a (relative) drop of more than one paper per year in the postmedal period for the Fields Medal recipients. In other words, even after controlling for individual-specific productivity differences and aging effects, there is a sharp decline in the productivity of the medalists after they were awarded the medal.

The specification changes reported in the remaining rows of Table 1 corroborate this finding. Row 2 uses the $\log$ number of papers per year as the dependent variable but excludes from the regression those (relatively few) years where the elite mathematicians did not publish at all. The log papers regression shows a 24 percent decline in productivity in the postmedal period. Row 3 reports the coefficient from a quantile regression where the dependent variable is the median number of papers per year (using bootstrapped standard errors clustered at the mathematician level). The regression shows a decline of -0.7 papers per year in the postmedal period. Finally, the last two rows of the table use alternative methods for ascertaining the "medal year" in the sample of contenders: either at age 36 (the median age at which Fields Medal recipients actually receive their medal) or age 40 (the maximum age of eligibility). The estimate of the coefficient $\beta$ is robust to these alternative definitions.

The last two columns of the table report the estimated coefficients when the control group includes all 86 members of the sample of contenders (that is, all the prize winners without any quality cutoff). Regardless of the method used to define the sample of contenders, the regression coefficients are similar. The data reveals that the Fields Medal recipients produce between 0.9 and 1.4 fewer papers per year in the postmedal period (or roughly a 20 percent decline in productivity) than would be predicted either from their previous output or from the output of other great mathematicians who did not win the highly coveted prize. ${ }^{16}$

The observed decline in the annual number of publications cannot be attributed to either the effect of mechanical mean reversion or to an "expectation bias" among the members of the award committee. Suppose that a mathematician's observed productivity at a point in time has a transitory component. As Lazear (2004) notes, the population of mathematicians whose productivity is above some bar at time $t$ will always show an average decline in productivity after time $t$ due to mean reversion in the transitory component of output. To avoid this type of contamination, we restricted our analysis to contenders who had reached similarly high productivity levels in the Fields Medal eligibility period. As a result, any mean reversion should operate equally on both groups.

Second, the award committee members, containing some of the best mathematicians in the world, surely observe future predictors of productivity among the contenders that we cannot measure in a publication database, and they may be swayed by this private information in their discussions. Given the future expectations bias, therefore,

[^10]it would not be surprising if the tournament winners do better in the post-tournament period. This bias would imply that our regression coefficients understate the true postmedal productivity decline.

We suspect, however, that this bias is less likely to be important in the context of the Fields Medal than in comparable tournaments in "softer" sciences, such as the John Bates Clark Medal in economics. First, publication lags for groundbreaking papers in pure mathematics can be considerably shorter than they are in economics. Second, many competing groups of mathematicians are often working on the next great unsolved problems at once. Not surprisingly, they often wait until the proof is sufficiently complete before discussing their techniques openly. Finally, even the private information that a mathematician is out to prove Hilbert's Eighth Problem is unlikely to influence the Fields Medal committee, as the resulting proof will either be correct or not and the committee cannot determine the validity of the proof in advance. In contrast, an interesting and fertile research agenda in applied economics can often produce exciting papers regardless of the direction in which the data point. ${ }^{17}$

The AMS data also allow us to examine other output effects of the Fields Medal. Table 3 reestimates the basic regression model using alternative dependent variables. The dependent variable in Row 1 is the probability that a mathematician publishes at least one paper in a given year. The relative probability of publishing a paper falls by about 11.8 percentage points for the medalists in the postmedal period. Row 2 uses the number of citations generated by papers written in year $t$ as the dependent variable. Although the AMS data only report the post-2000 citations for a paper regardless of when the paper was published, the calendar year fixed effects included in the regression model should control for the variation in citations between older and newer papers. ${ }^{18}$ The coefficient $\beta$ is again negative and significant, suggesting a decline of about 44 citations annually for papers produced in the postmedal period.

Part of the decline in citations is attributable to the fact that the medalists are less likely to publish (and publish fewer papers when they do publish). Row 3 uses the number of citations per paper published in a given year as the dependent variable (excluding years when the mathematician did not publish at all). The material published by the medalists in the postmedal period is, on average, less citation-worthy than the material published by the contenders. Even if the typical postmedal paper written by a medalist generates fewer citations, the medalist may be just as likely to

[^11]Table 3
Impact of the Fields Medal on Other Annual Measures of Productivity

| Dependent Variable | Sample of Contenders |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | Contenders with Above-Median Citations |  | All Contenders |  |
|  | Postmedal Period | Postmedal Period <br> $\times$ Fields Medal | Postmedal Period | Postmedal Period <br> $\times$ Fields Medal |
| Published at least one paper | $\begin{gathered} 0.030 \\ (0.041) \end{gathered}$ | $\begin{gathered} -0.118 \\ (0.047) \end{gathered}$ | $\begin{gathered} -0.002 \\ (0.030) \end{gathered}$ | $\begin{gathered} -0.092 \\ (0.044) \end{gathered}$ |
| Number of citations | $\begin{aligned} & -1.146 \\ & (13.480) \end{aligned}$ | $\begin{gathered} -44.182 \\ (14.645) \end{gathered}$ | $\begin{gathered} 5.448 \\ (8.826) \end{gathered}$ | $\begin{gathered} -44.493 \\ (12.631) \end{gathered}$ |
| Citations per paper | $\begin{gathered} 2.204 \\ (3.351) \end{gathered}$ | $\begin{array}{r} -11.000 \\ (3.145) \end{array}$ | $\begin{gathered} 2.560 \\ (2.739) \end{gathered}$ | $\begin{array}{r} -10.716 \\ (2.866) \end{array}$ |
| Probability of a "home run" | $\begin{gathered} 0.062 \\ (0.035) \end{gathered}$ | $\begin{gathered} -0.075 \\ (0.034) \end{gathered}$ | $\begin{gathered} 0.054 \\ (0.027) \end{gathered}$ | $\begin{gathered} -0.075 \\ (0.031) \end{gathered}$ |
| Probability of a "strike out" | $\begin{gathered} 0.009 \\ (0.024) \end{gathered}$ | $\begin{gathered} 0.053 \\ (0.028) \end{gathered}$ | $\begin{gathered} 0.022 \\ (0.021) \end{gathered}$ | $\begin{gathered} 0.058 \\ (0.026) \end{gathered}$ |
| Number of mentees | $\begin{gathered} -0.016 \\ (0.078) \end{gathered}$ | $\begin{gathered} -0.126 \\ (0.074) \end{gathered}$ | $\begin{gathered} -0.017 \\ (0.054) \end{gathered}$ | $\begin{gathered} -0.137 \\ (0.058) \end{gathered}$ |
| Number of papers published by mentees | $\begin{gathered} 1.430 \\ (3.194) \end{gathered}$ | $\begin{gathered} -3.981 \\ (2.522) \end{gathered}$ | $\begin{gathered} 0.883 \\ (2.364) \end{gathered}$ | $\begin{gathered} -4.932 \\ (1.828) \end{gathered}$ |
| Number of citations generated by mentees | $\begin{gathered} -12.676 \\ (44.334) \end{gathered}$ | $\begin{gathered} -56.309 \\ (37.395) \end{gathered}$ | $\begin{gathered} -17.963 \\ (29.630) \end{gathered}$ | $\begin{gathered} -60.682 \\ (29.787) \end{gathered}$ |

Notes: Standard errors are reported in parentheses and are clustered at the individual level. The regressions using the sample of contenders with above-median citations have 3,269 observations; the regressions using the sample of all contenders have 5,213 observations. The sample sizes for the regressions reported in Rows 3-5 are 2,719 and 4,109 observations, respectively; and the sample sizes for the regressions reported in Rows 5-7 are 2,999 and 4,797, respectively. A "home run" occurs when the number of citations per paper published in a given year is above the 99.5 th percentile for all mathematicians in the AMS database; a "strike out" occurs when the number of citations per paper published in a given year is zero.
hit a "home run." We calculated a vintage-specific citation cutoff for papers published each year using the universe of publications in the AMS database. By definition, a mathematician hits a "home run" if the number of citations per paper published that year was above the 99.5 th percentile for all mathematicians in the AMS database. Row 4 shows that the (relative) probability that a medalist hits a home run in the postmedal period declines by 15.6 percentage points. At the other extreme, a mathematician may "strike out" and write papers that are never cited. Row 5 shows that the medalist's (relative) probability of striking out rises by 5.3 percentage points in the postmedal period.

Finally, many of these elite mathematicians devote considerable time and effort to training the next generation of mathematicians. In fact, biographies and laudations of their achievements emphasize the training and mentoring of students as evidence of their long-lasting impact on mathematics. We therefore also examine the impact of the Fields Medal on the medalists' mentoring activities.

We obtained access to the data in the Mathematics Genealogy Project (MGP), and we merged the genealogy data with the AMS publication data. The MGP data identify the intellectual progeny of the renowned mathematicians in our sample, as well as the year in which those students received their doctoral degree. We were able to match 104 of the 133 mathematicians using an MGP-AMS match provided by the administrators of the MGP. For 28 of the remaining 29 unmatched mathematicians, we were able to obtain information about the graduation years and names of their students from namebased searches of their curriculum vitae, obituaries, or unmatched online MGP entries. The merged data also provide information on the research output of the students in their postdoctoral career. ${ }^{19}$ The merged data, therefore, allow us to examine not only the impact of the Fields Medal on the number of students produced in the postmedal period but also the impact on the quality of the students.

We are interested in the relation between the timing of the year in which a student becomes an elite mathematician's mentee and the year in which the mathematician receives (or does not receive) the Fields Medal. The mentoring agreement typically occurs two to four years before the student obtains his or her doctoral degree. We lag the MGP degree date by three years to approximate the year in which the mentoring relationship began. ${ }^{20}$

It turns out that Fields Medal recipients are not only publishing fewer papers in the postmedal period, and that those papers are relatively less important, but they are also accepting fewer mentees under their wing. Row 6 of Table 3 reports the relevant coefficients when we estimate the regression model using the number of mentees as the dependent variable. The regression shows a (marginally significant) relative decline in the number of mentees accepted by the Fields Medal recipients of about 0.1 students per year. The last two rows estimate the regression model using the mentee's total number of publications and citations over their career to date as dependent variables.

[^12]The results show a pronounced decline in the quality-adjusted student output of Fields Medal recipients in the postmedal period.

## An Alternative Control Group

It is important to establish that the evidence reported in Tables 2 and 3 cannot be attributed to idiosyncratic properties of the method we used to construct the control group of contenders. In fact, it is easy to show that the results are almost identical if we pursued a drastically different method for constructing the sample of contenders. In addition to the various prizes discussed above, the mathematics profession honors a select number of elite mathematicians with invitations to be "plenary speakers" at the quadrennial International Congress of Mathematicians. The qualifications required for receiving such an invitation are clearly stated in the memo detailing the program committee's responsibilities (ICM 2007):
"Plenary lectures are invited one-hour lectures to be held without other parallel activities. . . . The lectures should be broad surveys of recent major developments, aimed at the entire mathematical community. Plenary speakers should be outstanding mathematicians and good lecturers. It is the privilege of the PC [Program Committee] to select the plenary speakers."

The program committees in charge of organizing the plenary lectures have typically scheduled around 20 plenary lectures at each ICM in recent decades. There have been 269 plenary speakers since the 1950 ICM, and these speakers include 34 of the 50 mathematicians awarded the Fields Medals during this period. We again obtained the lifetime publication record for each of the invited plenary speakers from the AMS archives, and were able to determine the year of birth for all but eight of the speakers. We then reestimated the basic regression model in Equation 1 using the group of plenary speakers (who did not win the Fields Medal) as the control group. ${ }^{21}$

Table 4 summarizes the key results from our replication of the analysis. We illustrate the robustness of the evidence by estimating alternative specifications of the regression model, including using the group of all plenary speakers as contenders or only the group of plenary speakers who received an invitation to present a lecture by age $44 .{ }^{22}$ In addition, the table illustrates the robustness of the results when these samples are further restricted to only include mathematicians whose citation rate during the eligibility period placed them in the top half of the group. Regardless of the exact definition of the control group, the evidence summarized in Table 4 is similar to that discussed earlier (both qualitatively and quantitatively). Fields Medal recipients publish around one fewer paper annually after they receive the medal, the papers they do publish get cited less often, and they have a lower probability of hitting a home run and a higher probability of striking out. Because the evidence is robust to the definition

[^13]Table 4
Impact of the Fields Medal Using ICM Plenary Speakers as Control Group

| Specification | Sample of Contenders |  |  |  |
| :---: | :---: | :---: | :---: | :---: |
|  | All Plenary Speakers |  | Plenary Speakers with AboveMedian Citations |  |
|  | Postmedal Period | Postmedal Period <br> $\times$ Fields Medal | Postmedal Period | Postmedal Period <br> $\times$ Fields Medal |
| A. Contenders invited to be plenary speakers at any age |  |  |  |  |
| Number of papers | 0.096 | -1.076 | -0.091 | -0.955 |
|  | (0.189) | (0.356) | (0.291) | (0.432) |
| Log number of papers | -0.014 | -0.239 | -0.059 | -0.183 |
|  | (0.043) | (0.080) | (0.059) | (0.088) |
| Citations | 8.998 | -50.058 | 3.749 | -47.642 |
|  | (7.305) | (9.698) | (11.742) | (14.952) |
| Citations per paper | 1.217 | -10.950 | 0.257 | -10.012 |
|  | (2.011) | (2.709) | (3.035) | (4.013) |
| Probability of a "home run" | 0.030 | -0.078 | 0.034 | -0.066 |
|  | (0.019) | (0.029) | (0.029) | (0.032) |
| Probability of a "strike out" | 0.006 | 0.073 | 0.011 | 0.048 |
|  | (0.152) | (0.024) | (0.018) | (0.023) |

Number of papers

## Log number of papers

## Citations

## Citations per paper

Probability of a "home run"
Probability of a "strikeout"
Notes: Standard errors are reported in parentheses and are clustered at the individual level. The sample sizes for the regressions reported in Rows 1 and 3 of Panel A are 9,011 and 5,133 observations, respectively; and the sample sizes for the regressions reported in all other rows are 7,505 and 4,396 , respectively. The sample sizes for the regressions reported in Rows 1 and 3 of Panel B are 4,745 and 3,171 observations, respectively; and the sample sizes for the regressions reported in all other rows are 3,966 and 2,655 , respectively. A "home run" occurs when the number of citations per paper published in a given year is above the 99.5 th percentile for all mathematicians in the AMS database; a "strike out" occurs when the number of citations per paper published in a given year is zero.
of the control group, the analysis presented in the remainder of this paper reverts to the simpler definition of a control group that uses the sample of mathematicians who have received one of the six prestigious awards noted earlier.

## V. Cognitive Mobility

The postmedal productivity of Fields Medal recipients, in terms of the number of papers published, citations generated, or students mentored, is lower than would have been expected. A question immediately arises: What exactly are the medalists doing with their time in the postmedal period?

One obvious possibility is that the expansion in a mathematician's opportunity set implied by the Fields Medal introduces incentives to consume more leisure - along the lines of the wealth effect in the neoclassical labor-leisure model. As long as leisure is a normal good, the increase in the opportunity set associated with the Fields Medal (which includes the value of the additional prestige, job offers, grant opportunities, etc.) could lead to the medalists behaving in the predicted fashion and increasing their consumption of leisure. The increased leisure leaves less time for writing papers and supervising students.

In fact, the neoclassical labor-leisure model has a second implication: The Fields Medal should increase his consumption of all normal goods. A medalist could respond by increasing his consumption of "enjoyable research" in fields outside of pure mathematics and perhaps begin to dabble in such disciplines as biology and economics. ${ }^{23}$ Moreover, the medalist now may perceive a freedom to pursue research topics that lead to riskier outcomes than he would have pursued otherwise. ${ }^{24}$ These shifts in research interests may also affect productivity.

We apply the concept of "cognitive mobility" to analyze the choice of postmedal research topics by the elite mathematicians in our sample. As noted in Borjas and Doran (2015), knowledge producers who are conducting research on a particular set of questions may respond to changed opportunities by shifting their time, effort, and other resources to a different set of questions. Cognitive mobility then measures the transition from one location to another in idea space.

We compare the cognitive mobility rates of the medalists and contenders in the postmedal period. As noted earlier, the AMS data provides information not only on the annual output (as measured by papers and citations) of mathematicians but also categorizes each paper into one of the 73 fields that make up the discipline of mathematics and related subjects. Because of the large number of fields, it is obvious that we need to reduce the dimensionality of the space of ideas in order to operationalize the concept of cognitive mobility in the current context.

[^14]Assume that a mathematician's career begins the year he publishes his first paper. We can then examine the distribution of a mathematician's research topics in, say, the first $x$ years of his career. The AMS data allow us to determine the modal field of the papers published in those years as the mathematician was getting his career started and signaling his "quality" to the rest of the profession.

Although mathematics is composed of 73 fields, some of these fields are intellectually close to the modal field while others are unrelated. The notion of cognitive mobility, therefore, should incorporate the fact that a move between the modal field and any other field may be "cognitively close" or "cognitively far." To determine the cognitive distance between any two fields, we calculated a matrix with elements $\left[f_{i j}\right]$ showing the fraction of references made by papers published in field $i$ to papers published in field $j .{ }^{25}$ To illustrate, suppose that the modal field was Partial Differential Equations. The three most closely related fields (with the three largest values of $f_{i j}$ ) are Partial Differential Equations itself, Global Analysis, and Fluid Mechanics. These three fields account for 72 percent of all references made by papers published in Partial Differential Equations. At the other extreme, papers published in Partial Differential Equations never referenced papers published in either General Algebraic Systems or K-Theory.

It turns out that we typically do not need to expand the definition of "cognitively close" beyond 15 fields to capture almost all the references made by papers published in field $i$. For example, 77.6 percent of all references made in Partial Differential Equations are to the top five fields, 87.4 percent are to the top ten, and 92.5 percent are to the top 15 . This clustering around a very small number of fields is quite representative of the discipline of mathematics. In particular, 93.1 percent of the references in papers published in the median field of mathematics are made to papers published in only 15 other fields (the respective statistics for the 10th and 90th percentile fields are 87.6 and 97.5 percent).

Of course, it is not uncommon for elite mathematicians to move within a small (and often related) set of fields in the early part of their career. To capture this oscillation, we expand the definition of the "modal field" to include either the most common or the second most common field in the early part of a mathematician's career. For each of these two modes, we then constructed the set of the 15 most related fields. Our cognitive mobility variable then indicates if the mathematician moved outside the two modal fields and all related fields (in other words, if the mathematician moved out of the potential maximum of 30 fields that broadly define his initial research interests or "comfort zone").

To easily illustrate the trends in cognitive mobility, we first define the "early career period" as the eligibility period for the Fields Medal (that is, the years before the Fields Medal recipient won the medal or the years in which contenders were eligible for the medal). We then calculate the probability that papers published in each year of a mathematician's career are outside the comfort zone (or in a different field than the
25. It is not possible to estimate this matrix with the data that the AMS provided us. We instead purchased citation data from the ISI Web of Science to calculate these distance measures; see the Data Appendix to Borjas and Doran (2012) for details. The calculation of the matrix uses all publications in the 1979-2009 period.


Figure 2
The probability of cognitive mobility for the Fields Medal recipients and the contenders (three-year moving average)
Notes: The group of "contenders" is composed of persons who were awarded at least one of six other mathematics prizes (the Abel, Wolf, Cole Algebra, Bôcher, Veblen, and Salem Prizes) and have abovemedian per-year citations during the eligibility period for the Fields Medal but were not awarded the Fields Medal. Cognitive mobility indicates if a paper published at any point during the mathematician's career differs from the "baseline fields" in the eligibility period for the Fields Medal. The "baseline field" is defined by the set of the two modal fields and all related fields in which the mathematician published during the eligibility period. We smooth out the trend by using a three-year moving average centered on the middle year in the interval.
two modal and related fields). Figure 2 plots this measure of cognitive mobility. As before, Fields Medal recipients are plotted relative to the year they actually received the medal, and the contenders are plotted relative to the last year of eligibility.

The probability that either the medalists or contenders strayed from their comfort zone prior to the medal year is small, around 5 percent a year for mathematicians in either group. This similarity, however, breaks down dramatically in the postmedal period. The rate of cognitive mobility doubled to 10 percent for the contenders but rose dramatically for the medalists, quintupling to 25 percent. In short, the data reveal that the awarding of the Fields Medal is associated with a strong increase in the likelihood that a mathematician tries out fields that are very distant from those fields that established his reputation.

To determine if this correlation persists after controlling for individual and period fixed effects, we use the AMS data to construct a panel where an observation repre-
sents a paper published by each mathematician. In particular, let $p_{\text {int }}$ be an indicator variable set to unity if the field of the $n^{\text {th }}$ paper published by mathematician $i$ (and published in year $t$ ) differs from that of the modal and related papers in the baseline period. We then estimate the regression model:

$$
\begin{equation*}
p_{\text {int }}=\delta_{i}+\delta_{t}+\alpha T_{i}+\beta\left(T_{i} \times F_{i}\right)+Z_{i} \gamma+\varepsilon . \tag{2}
\end{equation*}
$$

Table 5 reports the relevant coefficients ( $\alpha, \beta$ ) using several alternative specifications. As with the illustration in Figure 2, the first row of the table uses the publications in the eligibility period to define the set of fields that make up the mathematician's comfort zone. We illustrate the robustness of our results by using either the two modal fields (and up to 30 related fields) or just simply the modal field (and its 15 related fields). Regardless of the specification, the awarding of a Fields Medal substantially increases the rate of cognitive mobility. Even after controlling for individual-specific fixed effects, the awarding of the Fields Medal increases the probability of a move by between 16 and 21 percentage points.

The next two rows of the top panel conduct sensitivity tests by using alternative definitions of the "early career" period used to construct the mathematician's comfort zone. Row 2 uses the first three years of the career while Row 3 uses the first five years. Similarly, the regressions in Panel B use the entire sample of contenders (without any quality cutoff) to estimate the model. Regardless of the specification, the awarding of the Fields Medal has a positive and significant impact on the probability that a mathematician engages in cognitive mobility. ${ }^{26}$

The freedom to try out new things, however, does not come cheap. Cognitive mobility, like any other type of move, can be costly. The mathematician is exiting a field in which he has remarkable technical skills and attempting to prove theorems in areas in which his intuition may not be as strong and in which the proofs may require a new set of tools. It would not be surprising, therefore, it if takes longer to produce a paper after the mathematician has engaged in cognitive mobility.

Define the duration of a "preparation spell" as the length of time elapsed (in years) between any two consecutive papers in a mathematician's career. We estimated a regression model to measure the relation between the length of the preparation spell for paper $n(n>1)$ and cognitive mobility:

$$
\begin{equation*}
\pi_{i n t}=\delta_{i}+\delta_{t}+\lambda_{F}\left(F_{i} \times p_{i n t}\right)+\lambda_{C}\left(C_{i} \times p_{i n t}\right)+Z_{i} \gamma+\varepsilon, \tag{3}
\end{equation*}
$$

where $\pi_{i n t}$ gives the length of the preparation spell required to write paper $n ; p_{i n t}$ is the indicator variable set to unity if paper $n$ involved a cognitive move; and $C_{i}$ is a variable indicating if mathematician $i$ is a contender $\left(C_{i}=1-F_{i}\right)$. Table 6 summarizes the estimates of the vector $\left(\lambda_{F}, \lambda_{C}\right)$ using alternative specifications of the model. It is evident that cognitive mobility is associated with a longer preparation spell for both the medalists and the contenders, and the effect is numerically important. A

[^15]Table 5
Impact of the Fields Medal on the Probability of Cognitive Mobility

|  | Baseline Field Defined Using Two Modes |  |  |
| :--- | :---: | :---: | :---: | :---: |
|  |  |  | Baseline Field Defined Using One Mode |

[^16]Table 6
Cognitive Mobility and the Duration of the Preparation Spell

|  | Baseline Field Defined Using Two Modes |  | Baseline Field Defined Using One Mode |  |
| :--- | :---: | :---: | :---: | :---: |
| Sample and Specification |  | Contender |  | Fields Medal Recipient |$\quad$ Contender

Notes: Standard errors are reported in parentheses and are clustered at the individual level. The length of the preparation is the length of time elapsed (in years) between any two consecutive papers in a mathematician's career. The "Baseline Field" is defined by the set of the (one or two) modal fields and all related fields in which the mathematician published during the baseline period (either the entire eligibility period, the first three years, or the first five years of his career). The dependent variable is the length of the preparation spell for each paper. The regressions in Panel A have 10,821 observations; the regressions in Panel B have 14,495 observations.
cognitive move increases the length of the preparation spell by between 0.16 and 0.23 years.

In sum, the data indicate that the Fields Medal recipients engaged in more cognitive mobility in the postmedal period and that cognitive mobility imposes a cost; it takes longer to produce a paper. This behavior, therefore, will inevitably result in a reduced rate of publication for the medalists in the postmedal period.

The regression coefficients can be used to conduct a back-of-the-envelope calculation that determines how much of the observed decline in productivity was due to cognitive mobility. The results in Table 5 indicate that the awarding of the Fields Medal increased the probability of cognitive mobility for a paper published in the postmedal period by around 15 percent. Both the medalists and the contenders published four papers per year at the time the medal was awarded (see Figure 1). Using this rate of output as the baseline, the regression coefficient in Table 5 indicates that the awarding of the medal led to a 0.6 increase (or $0.15 \times 4$ ) in the number of papers published annually in an unfamiliar field.

At the same time, Table 6 shows that cognitive mobility increases the length of a preparation spell by about 0.2 years. Putting these results together implies that the increased incentive for cognitive mobility in the postmedal period and the longer preparation spell reduces the amount of "effective" time available in a given year by about 0.12 years (or the 0.6 papers published in an unfamiliar field times the 0.2 longer years it takes to produce such a paper). In rough terms, therefore, we expect a 12 percent decline in the number of papers that a medalist published annually in the postmedal period simply because cognitive mobility diverts 12 percent of his time to other uses (such as learning new skills). As we saw in Table 2, there was a 24 percent decline in annual output. The increased experimentation exhibited by Fields Medal recipients in the postmedal period can account for about half of the decline in productivity.

It is important to emphasize that the decline in productivity resulting from the wealth effect that increases leisure is conceptually different from the decline induced by the increased experimentation. Although the cognitive mover publishes fewer papers, those papers may provide a social benefit. The medalist is applying his talents to unfamiliar questions and may generate important insights in areas that were previously underserved by exceptional mathematical talent.

In fact, among the great architects of late 20th century mathematics in our sample, there are three well-known examples in which a Fields Medal recipient who made extraordinary contributions to a specific area of pure mathematics went on to mathematize a distant applied subject later in their career: René Thom (and his development of singularity/catastrophe theory), David Mumford (and the mathematics of vision and pattern theory), and Stephen Smale.

Smale's experience is particularly illuminating. Gleick (1987, p. 45) recounts what happened soon after Smale proved a pure mathematics result (the Generalized Poincaré conjecture) that helped earn him the Fields Medal.
"Smale [was]. . . already famous for unraveling the most esoteric problems of many-dimensional topology. A young physicist, making small talk, asked what Smale was working on. The answer stunned him: 'Oscillators.' It was absurd. Oscillators - pendulums, springs, or electrical circuits - were the sort of problem
that a physicist finished off early in his training. They were easy. Why would a great mathematician be studying elementary physics?"

Even if a young physicist considered Smale's new choice of topic simplistic and absurd, the enormity of the mathematician's previous achievements insulated him from any real loss of prestige. Smale's postmedal experimentation built the mathematical foundation of chaos theory. In fact, Smale went on to make important contributions in biology, astronomy, and even in theoretical economics.

## VI. Summary

A vast literature explores the impact of tournaments, contests, and prizes on the productivity of tournament participants, analyzing the implications of pre-award productivity effects for the efficient design of incentive mechanisms. A working assumption in this literature is that the labor supply consequences of actually winning a tournament are minimal. This paper studies the impact of winning a tournament on the productivity and effort choices of tournament participants in the post-tournament period.

We examine how winning the Fields Medal affects the postmedal productivity and research choices of mathematicians. The Fields Medal is the most prestigious award in mathematics, awarded every four years to mathematicians under the age of 40 . Using archival data from the American Mathematical Society and the Mathematics Genealogy Project, we document the shape of the age-productivity profile of these exceptional mathematicians along a number of different dimensions, including the number of papers published, citations received, and students mentored. We find that the age-productivity profile of the Fields Medal recipients and of the losing contenders is similar until the year in which a particular mathematician wins the Fields Medal (or does not win it). Remarkably, the rate of output of the Fields Medal recipients declines noticeably in the postmedal period.

We also show that the medalists exhibit a far greater rate of cognitive mobility in the postmedal period, pursuing topics that are far less likely to be related to their premedal work. Because cognitive mobility is costly (for example, additional time is required to prepare a paper in an unfamiliar field), the increased rate of mobility reduces the medalists' rate of output in the postmedal period. The data suggest that about half of the decreased productivity in the postmedal period can be attributed to the increased propensity for experimentation.

Hundreds of scientific and technical prizes are awarded around the world. Our evidence suggests that the postprize productivity impact of winning a prestigious award can be substantial, affecting both the quantity and type of research the winners produce. Although some Fields Medal recipients may have taken Hermann Weyl's words to heart and "carried on as they began," this was not the typical outcome. The data instead reveal that the increased opportunities provided by the Fields Medal, in fact, discouraged the recipients from continuing to produce the pure mathematics that the medal was awarded for while encouraging time-consuming investments in ever more distant locations in the space of ideas.

## Appendix

## List of Fields Medal Recipients and Contenders

Anantharaman, Nalini ${ }^{s}$
Arnold, Vladimir ${ }^{\text {W }}$
Artin, Michael ${ }^{W}$
Aschbacher, Michael ${ }^{\text {w,C }}$
Astala, Kari ${ }^{\text {s }}$
Atiyah, Michael ${ }^{\text {F,A }}$
Avila, Artur ${ }^{\text {S }}$
Baker, Alan ${ }^{\text {F }}$
Beckner, William ${ }^{\text {S }}$
Bombieri, Enrico ${ }^{F}$
Borcherds, Richard ${ }^{\text {F }}$
Bott, Raoul w
Bourgain, Jean ${ }^{\text {F,S }}$
Brown, Morton ${ }^{V}$
Caffarelli, Luis ${ }^{\mathrm{W}, \mathrm{B}}$
Calderón, Alberto ${ }^{W}$
Carleson, Lennart ${ }^{\text {A, W }}$
Chandra, Harish ${ }^{C}$
Cohen, Paul ${ }^{\mathrm{F}, \mathrm{B}}$
Connes, Alain ${ }^{\text {F }}$
Dahlberg, Björn ${ }^{\text {S }}$
David, Guy ${ }^{\text {s }}$
de Jong, Aise Johan ${ }^{\text {C }}$
Deligne, Pierre ${ }^{\text {F,A,W }}$
Donaldson, Simon ${ }^{\text {F }}$
Drinfeld, Vladimir ${ }^{F}$
Faltings, Gerd ${ }^{\mathrm{F}}$
Fefferman, Charles ${ }^{\text {F,B,S }}$
Feit, Walter ${ }^{\text {C }}$
Freedman, Michael ${ }^{\text {F,V }}$
Furstenberg, Hillel ${ }^{\text {w }}$
Gowers, Timothy ${ }^{F}$
Green, Ben ${ }^{\text {s }}$
Griffiths, Phillip w
Gromov, Mikhael ${ }^{\text {A,W,V }}$
Grothendieck, Alexander ${ }^{F}$
Hacon, Chistopher ${ }^{\text {C }}$
Herman, Michael-Robert ${ }^{\text {S }}$
Hironaka, Heisuke ${ }^{F}$
Hirzebruch, Friedrich ${ }^{w}$
Hochster, Melvin C
Hörmander, Lars ${ }^{\text {F,W }}$
Hunt, Richard ${ }^{\text {S }}$
Jones, Vaughan ${ }^{F}$

Jones, Peter ${ }^{\text {S }}$
Journé, Jean-Lin ${ }^{\text {S }}$
Keller, Joseph w
Kenig, Carlos ${ }^{s}$
Kirby, Robion ${ }^{V}$
Klartag, Boáz ${ }^{\text {s }}$
Kontsevich, Maxim ${ }^{\text {F }}$
Konyagin, Sergei s
Körner, Thomas $s$
Lacey, Michael ${ }^{\text {S }}$
Lafforgue, Laurent ${ }^{F}$
Lang, Serge ${ }^{C}$
Langlands, Robert ${ }^{W}$
Lax, Peter ${ }^{\text {A,W }}$
Lindenstrauss, Elon ${ }^{\text {F,S }}$
Lions, Pierre-Louis ${ }^{F}$
Lovász, László ${ }^{W}$
Lusztig, George ${ }^{\text {C }}$
Margulis, Grigory F,W
Mazur, Barry ${ }^{\text {V }}$
McMullen, Curtis ${ }^{\text {F,S }}$
Melrose, Richard ${ }^{B}$
Meyer, Yves ${ }^{\text {S }}$
Milnor, John F,A,W
Montgomery, Hugh ${ }^{\text {S }}$
Mori, Shigefumi ${ }^{F, C}$
Moser, Jürgen ${ }^{\text {W }}$
Mostow, George ${ }^{W}$
Mumford, David ${ }^{\text {F,W }}$
Naor, Assaf B,S
Nazarov, Fedor ${ }^{s}$
Ngô, Báo Châu ${ }^{F}$
Nikishin, Evgeniĭ ${ }^{\text {S }}$
Nirenberg, Louis ${ }^{B}$
Novikov, Sergei ${ }^{\text {F,W }}$
Okounkov, Andrei ${ }^{\text {F }}$
Ornstein, Donald ${ }^{\text {B }}$
Ozsváth, Peter ${ }^{\mathrm{V}}$
Perelman, Grigori ${ }^{F}$
Petermichl, Stefanie ${ }^{\text {S }}$
Piatetski-Shapiro, Ilya ${ }^{W}$
Pichorides, Stylianos ${ }^{s}$
Pisier, Giles ${ }^{\text {S }}$
Quillen, Daniel F,C

Rosenlicht, Maxwell C
Roth, Klaus ${ }^{\text {F }}$
Sato, Mikio ${ }^{\text {w }}$
Schoen, Richard ${ }^{B}$
Schramm, Oded ${ }^{\text {S }}$
Seidel, Paul ${ }^{V}$
Serre, Jean-Pierre F,A,W
Shelah, Saharon ${ }^{W}$
Shishikura, Mitsuhiro ${ }^{s}$
Simons, James ${ }^{V}$
Sinaĭ, Yakov ${ }^{w}$
Singer, Isadore ${ }^{\text {A }}$
Smale, Stephen ${ }^{\text {F,W,V }}$
Smirnov, Stanislav F,S
Soundararajan, Kannan ${ }^{s}$
Stallings, John C
Stein, Elias ${ }^{W}$
Sullivan, Dennis W,V
Swan, Richard ${ }^{\text {C }}$
Szemerédi, Endre, A
Tao, Terence ${ }^{\text {F,B,S }}$
Tataru, Daniel ${ }^{\text {B }}$
Tate, John A, W
Taubes, Clifford ${ }^{\mathrm{V}}$
Thiele, Christoph ${ }^{\text {S }}$
Thom, René ${ }^{F}$
Thompson, John F,A,W,C
Thurston, William ${ }^{\text {F,V }}$
Tian, Gang ${ }^{\text {V }}$
Tits, Jacques ${ }^{\text {A, W }}$
Tolsa, Xavier ${ }^{\text {S }}$
Varadhan, S.R. ${ }^{\text {A }}$
Varopoulos, Nicholas ${ }^{\text {S }}$
Venkatesh, Akshay ${ }^{\text {S }}$
Villani, Cédric ${ }^{\text {F }}$
Voevodsky, Vladimir ${ }^{F}$
Volberg, Alexander ${ }^{s}$
Werner, Wendelin ${ }^{F}$
Wiles, Andrew w
Witten, Edward ${ }^{\text {F }}$
Wolff, Thomas ${ }^{S}$
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Notes: The superscripts indicate the prize awarded to the mathematician: F = Fields Medal; A = Abel Prize; W = Wolf Prize; C = Cole Algebra Prize; B = Bôcher Prize; V = Veblen Prize; and S = Salem Prize.

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[^1]:    1. Lazear and Rosen (1981) and Rosen (1986) give the classic presentations of the tournament model. Empirical evidence on the productivity effects includes Ehrenberg and Bognanno (1990); Knoeber and Thurman (1994); and Main, O'Reilly, and Wade (1993).
    2. Some recent studies address this question in the context of job promotions. Lazear (2004) offers an important discussion of the statistical problems introduced by mean reversion in the transitory component of productivity when measuring postpromotion productivity effects; see also the related empirical work in Anderson, Dubinsky, and Mehta (1999), and Barmby, Eberth, and Ma (2012).
    3. Zuckerman (1996) documents that the research output of Nobel Prize winners declines after winning the prize. Her descriptive evidence, however, is likely contaminated by the late age of the winners and the possibility of mean reversion because the comparison group is less productive prior to the awarding of the prize. Chan et al. (2013) and Bricongne (2014) present related studies of the impact of the John Bates Clark Medal on the productivity of economists and reach conflicting results. The productivity impact of the John Bates Clark Medal is discussed in more detail below. Finally, Azoulay, Graff-Zivin, and Manso. (2011) explore the impact of funding at the start of a scientist's career on subsequent productivity.
    4. Partly due to jealousy and conflict between Alfred Nobel and the Swedish mathematician Magnus Gotha Mittag-Leffler, Nobel famously left mathematics out of his list of recognized disciplines when he founded the prize that bears his name (Tropp 1976). Ironically, Fields and Mittag-Leffler were close friends.
[^2]:    5. The age restriction has been applied consistently over time. For example, the 1998 ICM stated: "As all the Committees before us, we agreed, . . . to follow the established tradition and to interpret the word 'young' as 'at most forty in the year of the Congress'" [emphasis added].
[^3]:    6. The goal of the French Bourbaki group was to write down all of mathematics as a linear development from general axioms. The arbitrariness of the decision to exclude Harish-Chandra is doubly ironic: "HarishChandra would have been as astonished as we are to see himself lumped with Thom and accused of being tarred with the Bourbaki brush, but whether he would have been so amused is doubtful, for it had not been easy for him to maintain confidence in his own very different mathematical style in face of the overwhelming popular success of the French school in the 1950s" (Langlands 1985, p. 212).
[^4]:    7. An alternative to the difference-in-differences approach would be the use of instrumental variables. The obvious choice of an instrument for winning the Fields Medal is given by the combination of the quadrennial timing of the award and the age cutoff: Some mathematicians have almost four more years to compete for the Fields Medal than others. While the resulting variation in the maximum number of "eligible work years" is positively related with winning the Fields Medal in the sample of contenders constructed below, the Angrist-Pischke multivariate $F$-tests of excluded instruments show that the relationship is not sufficiently strong to make it a useful instrument by itself.
    8. An alternative empirical strategy would be to rely on statistical matching based on papers per year or citations per paper to construct a sample of contenders from the universe of all mathematicians. We did not pursue this alternative approach for two reasons. First, it would be difficult to operationalize because a key variable in the matching algorithm would be year of birth (which determines eligibility for the Fields Medal). The birth year would need to be uncovered one at a time through archival research or one-on-one contact for the universe of potential matches in the AMS data. It turns out that approximating year of birth by year of first publication leads to a very poor approximation of the end of the eligibility period. Second, we prefer the approach of actually constructing a relevant group of contenders with "real" people because it uses the valuable information embedded in the profession's willingness to publicly acclaim a particular person's contributions with a scarce award (or, as discussed below, with an invitation to present a prestigious lecture). This type of construction likely leads to a better approximation of the "short list" of contenders considered by the prize committee.
[^5]:    9. The Abel Prize creates a multistage tournament for mathematicians. As in Rosen (1986), Fields Medal recipients may wish to keep participating in the tournament in order to receive the sizable monetary award associated with the Abel Prize. The changed incentives, however, are unlikely to affect our results because the Abel Prize began late in the sample period.
    10. There are many other mathematical prizes around the world, but they are far less prestigious or worse predictors of winning the Fields Medal. For example, none of the winners of the AMS Cole Prize for Number Theory has ever gone on to win the Fields Medal.
[^6]:    11. An alternative way of defining the final set of contenders would be to calculate the annual rate of papers published during the eligibility period and select the 43 mathematicians whose annual rate of output is above the median. The evidence reported below is similar if we used this alternative definition. We also accounted for the fact that the nature of the AMS citation data could imply that the number of citations received by more recent mathematicians may be greater than the number received by mathematicians active in the 1950s and 1960s. We defined an alternative final set of contenders based on the above-median ranking of the residual from a regression of the per-year number of citations in the eligibility period on the calendar year of first publication, and the results are very similar to those reported in the next two sections.
    12. We ignore the posthumous publications of the Fields Medal recipients and contenders.
[^7]:    13. Data on the impact of the Fields Medal on a winner's financial wealth are obviously very limited. Nevertheless, there is some evidence suggesting that the effect may be quite large. In particular, it is possible to examine the salary history of Fields Medal recipients employed at a few public universities (where the salary information is publicly released). Our examination of the salary history of one such winner, employed at a large public university in the western United States, indicates that the medalist experienced a $\$ 120,000$ salary increase (equivalent to a 67 percent raise) between the academic years preceding and subsequent to the award. The medalist's salary, in fact, continued to increase rapidly in subsequent years and was five standard deviations above the mean salary of full professors in the department six years after the award. This episode suggests that the impact of the Fields Medal on the present value of lifetime wealth (even when income is restricted only to academic earnings) can be substantial, totaling in the millions of dollars.
[^8]:    14. There are two additional types of productivity effects that may be important, though hard to measure. First, winning the Fields Medal "raises the bar" in terms of what a medalist perceives to be publishable output (and also in terms of what the mathematical community expects from him). In particular, the medalist may feel that he has a brand name to protect and is unwilling to devote his time or effort to smaller topics that could well lead to publishable, but not seminal, papers. Second, the medalist is likely to be distracted by competing offers for advice, speeches, etc. As Cédric Villani, a Fields Medal recipient in 2010, puts it, "Every Fields Medal winner knows how much the productivity decreases after the award. . . Just because you are so much invited and wanted by everybody - for juries, ceremonies, public speeches, TV, radio, newspapers" (Sparshott 2014).
[^9]:    15. Figure 1 seems to show a small decline in productivity among the Fields Medal recipients for a few years prior to the receipt of the medal. This decline is partly an artifact of the three-year moving average used in the figure. In fact, the only unusually low year of output actually occurs exactly one year before receipt of the Fields Medal. The number of papers published two years before receipt of the Fields Medal and during the year of the medal itself is either on or above the trend. We further examined the pretrend issue by estimating a regression specification that included a variable "years-since-medal" (both before and after) and interacted this variable with the indicator of whether the mathematician won the Fields Medal. We aggregated the years-since-medal variable into three-year intervals to obtain a sufficient sample size for each interaction. The regression revealed that only one of the premedal interactions was significant (and it was the one indicating the period at the beginning of the career) and none of the others were even marginally significant. In contrast, three of the postmedal interactions are significant, with four more being marginally significant. The data, therefore, strongly suggest that the small decline in productivity observed just before the awarding of the Fields Medal is not part of a consistent pretreatment trend of low output for the treated group.
[^10]:    16. We also examined the robustness of our results to the use of the Abel and Wolf prizes in the construction of the sample of contenders in two alternative ways: by excluding from the sample of contenders those mathematicians who won the Abel or Wolf prizes (yielding a sample of 35 contenders) or by only including in the sample of contenders those mathematicians who did win the Abel or Wolf prizes (eight contenders). The interaction coefficient $\beta$ is -0.908 (with a standard error of 0.458 ) in the first case and $-2.553(2.015)$ in the second.
[^11]:    17. During the two-year period in which we prepared this study, two related working papers examining the productivity effect of the John Bates Clark Medal were also produced. The evidence in these studies, however, is mixed. Chan et al. (2013) use a statistical matching approach and find a favorable productivity effect, while Brincogne (2014) constructs a control group composed of prominent economists and finds that the favorable productivity effect disappears once the regression controls for individual-specific fixed effects in productivity, suggesting that the net productivity effect of the medal may be slightly negative. Even if the evidence were less ambiguous, there are a number of issues that complicate the interpretation of the results from the John Bates Clark Medal studies. In particular, the John Bates Clark Medal is not the last stage of the tournament; there may well be "forward expectation bias" influencing the choice of the next John Bates Clark Medal recipient, and the additional grant funding that a John Bates Clark Medal recipient will likely generate will be an input in the production function for subsequent research (grant funding is a much less important input in the production of pure mathematics).
    18. The fact that our citation data only includes citations made after 2000 (regardless of when the paper was published) prevents us from addressing the possibility that receipt of the Fields Medal may itself cause the medalists' premedal work to become more highly cited in the post-2000 period than it otherwise would have been. A detailed analysis of this issue would require much more detailed (and contemporaneous) citation data.
[^12]:    19. For students whose AMS identification numbers are listed in the MGP database, we use the AMS data to calculate their career papers and citations. Many mathematics doctorates, however, do not publish a single paper in their career (and the mode for those who do is a single publication with zero citations; see Borjas and Doran 2012). The absence of a publication implies that the student will never appear in the MathSciNet database. We assume that the students who do not have an AMS identification number have zero lifetime publications and citations.
    20. The results are similar as long as we lag the degree date by two or more years.
[^13]:    21. It is interesting to note that 39 of the 86 contenders produced by the method based on receipt of mathematical prizes have also given a plenary lecture, as have 21 of the 43 "final" contenders with an above-median citation rate in the eligibility period.
    22. By restricting the sample to plenary speakers who gave their lecture before age 44 , we are indirectly attempting to construct a sample of outstanding mathematicians that includes those who "just missed" their chance for a Fields Medal because of the interaction between the age restriction and the quadrennial timing of the award.
[^14]:    23. Levin and Stephan (1991) and Stern (2004) suggest that some scientists, particularly theoretical ones, derive consumption value from doing research they enjoy.
    24. Since Arrow (1965) and Stiglitz (1969), it is well known that a wealth increase may prompt a utilitymaximizing agent to undertake riskier investments. Levhari and Weiss (1974) extended this insight to the human capital framework. As 2010 Fields Medal recipient Stanislav Smirnov notes, the pursuit of riskier investments raises the possibility that the medalist may be "doing something very important in the end" (Sparshott 2014).
[^15]:    26. We also examined the probability that a mathematician conducts research outside pure mathematics. Specifically, we constructed a variable indicating if a paper was in any of the following "applied" areas: "History and biography," "Statistics," "Computer science," "Geophysics," "Game theory, economics, social and behavioral sciences," "Biology and other natural sciences," "Information and communication, circuits," or "Mathematics education." The estimated regression coefficient suggests that the (relative) probability of a Fields Medal recipient publishing in one of these applied areas in the postmedal period rose by 75 percent.
[^16]:    Notes: Standard errors are reported in parentheses and are clustered at the individual level. The "baseline field" is defined by the set of the (one or two) modal fields and all related fields in which the mathematician published during the baseline period (either the entire eligibility period, the first three years, or the first five years of his career). The dependent variable is a cognitive mobility indicator set to unity if the field of publication for each paper during the mathematician's career is not in the baseline field. The regressions in Panel A have 10,911 observations; the regressions in Panel B have 14,628 observations.

