Predicting Fair Use

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Fair use is often criticized as unpredictable and doctrinally incoherent—a conclusion which necessarily implies that the copyright system is fundamentally broken. This Article confronts that critique by systematically assessing the predictability of fair use outcomes in litigation. Concentrating on characteristics of the contested use that would be apparent to litigants pretrial, this study tests a number of doctrinal assumptions, claims, and intuitions that have not, until now, been subject to empirical scrutiny.

This Article presents new empirical evidence for the significance of transformative use in determining the outcomes of fair use cases. It also substantially undermines conceptions of the doctrine that are hostile to fair use claims by commercial entities and that would limit the application of fair use as a subsidy or a redistributive tool favoring the politically and economically disadvantaged. Based on the available evidence, the fair use doctrine is more rational and consistent than is commonly assumed.

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I. INTRODUCTION

The concept of fair use is central to modern copyright law in the United States; however, almost every aspect of the fair use doctrine is highly contested. Moreover, the application of fair use is conventionally presumed to be uncertain. This assumed incoherence and unpredictability has led many to question the value of fair use.1 The critique that fair use is merely "a lottery

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1 LAWRENCE LESSIG, FREE CULTURE: HOW BIG MEDIA USES TECHNOLOGY AND THE LAW TO LOCK DOWN CULTURE AND CONTROL CREATIVITY 187 (2004); Michael J. Madison, A Pattern-Oriented Approach to Fair Use, 45 WM. & MARY L. REV. 1525, 1666 (2004) ("Fair use is an ex post determination, a lottery argument offered by accused infringers forced to gamble, after the fact, that they did not need permission before."); see also Thomas F. Cotter, Fair Use and Copyright Overenforcement, 93 IOWA L. REV. 1271, 1284 (2008) ("Fair use... remains fairly unpredictable and uncertain in many settings..."); James Gibson, Once and Future Copyright, 81 NOTRE DAME L. REV. 167, 192 (2005) ("Fair use... is too indeterminate a doctrine to provide a reliable touchstone for future conduct."); Edward Lee, Warming Up to User-Generated Content, 2008 U. ILL. L. REV. 1459, 1468
argument" and amounts to no more than "the right to hire a lawyer" is deeply important.\(^2\) In the digital age, innovation and freedom of expression increasingly require the use, reinterpretation, and remixing of copyrighted content; the fair use doctrine is often the only aspect of copyright law that makes these activities possible. It is not simply end users who rely on fair use: the doctrine is an essential part of the legal architecture of Internet search, Web 2.0 enterprises, and social networking technologies. If fair use is truly arbitrary and uncertain, our copyright system is fundamentally broken. This Article demonstrates that the uncertainty critique is somewhat overblown: an empirical analysis of the case law shows that, while there are many shades of gray in fair use litigation, there are also consistent patterns that can assist individuals, businesses, and lawyers in assessing the merits of particular claims to fair use protection.

This Article addresses the predictability of fair use by investigating the impact of identifiable characteristics on fair use outcomes. It takes specific doctrinal intuitions about fair use and evaluates the extent to which they are supported by the data. Each one of these building blocks is interesting in isolation; the aggregation of the discrete findings addresses a question of fundamental importance—the predictability of fair use.

Fair use allows the use of copyrighted material without permission; in so doing, it sets limits on the broad rights of copyright owners to control the reproduction, distribution, performance, and display of their works.\(^3\) The importance of fair use can be seen in recent marquee cases determining the legality of new consumer technologies,\(^4\) user-generated content,\(^5\) the limits of

\(^2\) LESSIG, supra note 1, at 187; Madison, supra note 1, at 1666.

\(^3\) Sections 106 and 106A of the Copyright Act of 1976 enumerate the exclusive rights of copyright owners, and a limited set of "moral rights" pertaining to the authors of works of visual art; however, these rights are expressly subject to sections 107 through 122 of the Act. Section 107 provides that "[n]otwithstanding the provisions of sections 106 and 106A, the fair use of a copyrighted work... is not an infringement of copyright." See 17 U.S.C. §§ 106, 106A, 107 (2006).

\(^4\) See, e.g., Sony Corp. of Am. v. Universal City Studios, Inc., 464 U.S. 417, 454–55 (1984) (holding that the manufacturer of a videocassette recorder was not liable for copyright infringement, in part because consumer time-shifting of broadcast television for later viewing was fair use and not copyright infringement); Recording Indus. Ass’n of Am. v. Diamond Multimedia Sys. Inc., 180 F.3d 1072, 1077 (9th Cir. 1999) (strongly suggesting that transferring music from compact disc to MP3 for personal use would be fair use and that the manufacturers of MP3 players would not be liable for copyright infringement); A & M Records, Inc. v. Napster, Inc., 114 F. Supp. 2d 896, 915 (N.D. Cal. 2000) (holding that peer-to-peer file-sharing of copyrighted music without authorization is not fair use).

\(^5\) See Warner Bros. Entm’t Inc. v. RDR Books, 575 F. Supp. 2d 513, 551 (S.D.N.Y. 2008) (finding that an unauthorized Harry Potter lexicon that contained substantial user-
fan fiction, and critical reinterpretation of literature. The fair use doctrine affects film production, news reporting, political communication, teaching, and academic research. Fair use exceptions keep copyright closer to the reasonable expectations of most people and thus help make sense of copyright law. Fair use also plays an important role in enabling technological progress because without fair use an unduly rigid application of copyright law would enable right holders to block important new technologies. Indeed, reliance on fair use is embedded in the core of the Internet, as it is a vital component of the search engine business model, Web 2.0 enterprises, and social media. Almost no one doubts that the fair use doctrine either is, or should be, very important; however, judges, academics, and lawyers express sharp disagreement over different conceptions of fair use and its correct application.

6 Id. 7 See Salinger v. Colting, 641 F. Supp. 2d 250, 268 (S.D.N.Y. 2009) (holding that a fictional novel recounting a meeting of Cather in the Rye’s Holden Caulfield at the age of seventy-six with the author of that same book, J.D. Salinger, was a substantial copy of the original novel and was unlikely to constitute fair use), vacated, 607 F.3d 68, 69 (2d Cir. 2010) (vacating injunction but agreeing defendants would not likely be able to make out such a defense).

8 See Am. Geophysical Union v. Texaco Inc., 60 F.3d 913, 914 (2d Cir. 1994) (finding that a researcher’s unauthorized photocopying of articles from an academic periodical was not fair use); Kenneth D. Crews, Fair Use and Higher Education: Are Guidelines the Answer?, ACAD., Nov.-Dec. 1997, at 38, 38 (criticizing "Classroom Guidelines" for providing inadequate guidance on the application of fair use in an educational environment). See generally Ass’n of Indep. Video & Filmmakers et al., Documentary Filmmakers’ Statement of Best Practices in Fair Use, CENTER FOR SOC. MEDIA (Nov. 18, 2005), http://www.centerforsocialmedia.org/sites/default/files/fair_use_final.pdf (reflecting the views of a number of filmmakers as to what constitutes reasonable application of the fair use doctrine).


10 Id. at 44.


12 In his classic article on the fair use doctrine, Judge Pierre Leval concedes that his “own decisions had not adhered to a consistent theory, and, more importantly, that throughout the development of the fair use doctrine, courts had failed to fashion a set of governing principles or values.” Pierre N. Leval, Toward a Fair Use Standard, 103 HARV. L. REV. 1105, 1105 (1990); see also Basic Books, Inc. v. Kinko’s Graphics Corp., 758 F. Supp. 1522, 1530 (S.D.N.Y. 1991) (“Courts and commentators disagree on the interpretation and application of the four [fair use] factors . . . .”).
Fair use is often criticized as doctrinally incoherent and unpredictable in application,\textsuperscript{13} so much so that it has become fashionable to question the value of fair use as a guide to decision making.\textsuperscript{14} Scholars have subjected the fair use doctrine to broad-ranging theoretical scrutiny and have undertaken precise analysis of leading cases.\textsuperscript{15} However, almost all of the literature is normative, anecdotal, or confined to particular subtopics.

There are two primary exceptions. Barton Beebe's pioneering empirical study of the contents of fair use opinions examines the language judges employ, the tests they use, and judicial characterizations of their own application of the four statutory fair use factors.\textsuperscript{16} Pamela Samuelson's systematic distillation of modern fair use jurisprudence into common patterns, or "policy-relevant clusters," makes a convincing case that fair use may not be as doctrinally incoherent as many have suggested.\textsuperscript{17} Each of these studies highlights consistent patterns in judicial analysis within the fair use decisions. Although this study builds upon the work of Beebe and Samuelson, it is also fundamentally different in both its methods and its objectives. Rather than relying on backward-looking judicial reasons and explanations for the outcomes of fair use cases, this new study assesses the predictability of fair use in terms of case facts which exist prior to any judicial determination. I focus directly on the ex ante predictability of fair use and empirically test the significance of the characteristics of disputed uses that would be apparent to potential litigants before their cases go to trial. This approach makes it possible to test a number of doctrinal claims and intuitions that have not, until now, been subject to empirical scrutiny. No one has previously attempted to systematically assess the predictability of fair use from the perspective that matters most—the point of view of prospective litigants. This Article fills that void, using statistical analysis to develop a clearer picture of the entire landscape of fair use cases.

This Article proceeds as follows. Part II begins with a brief explanation of the construction of the dataset and the key variables. Part III reviews


\textsuperscript{14} See \textit{supra} note 1 and accompanying text.

\textsuperscript{15} In the last ten years alone, at least 237 law review articles have been devoted to the issue of fair use—based on a Lexis search of U.S. law reviews with a title containing "fair use," but not containing "trademark." In short, the relevant literature is vast. (Search date: Feb. 23, 2011).


\textsuperscript{17} Pamela Samuelson, \textit{Unbundling Fair Uses}, 77 FORDHAM L. REV. 2537, 2537 (2009). Similarly, Michael Madison argues that existing case law can be reframed in terms of "whether the defendants' uses of copyrighted material [fall] appropriately within or beyond recognized social or cultural patterns." Madison, \textit{supra} note 1, at 1623.
extensive case law and commentary devoted to fair use and explains how abstract doctrinal questions, such as transformative use, can be reduced to empirically testable hypotheses. Part IV then presents the results of the empirical tests and explores their importance. The conclusion summarizes the principal findings of this study and their implications for fair use and copyright in general.

II. DATA & METHODOLOGY

A. Data

This study is based on a unique dataset of more than 280 fair use cases decided in U.S. District Courts between January 1, 1978 and May 31, 2011. The dataset combines publicly available information from written opinions and court records, as well as data from other sources such as company databases and the Martindale-Hubbell directory of attorneys and law firms.18

B. Dependent Variable

This Article explores the effect of a diverse range of objective factors in fair use litigation and determines whether the characteristics stressed in various judicial and academic accounts are actually important in practice. How should importance be judged? This study treats a case characteristic as important if it affects the outcome of the fair use issue in an individual case. For clarity, this variable is referred to as the successful assertion of fair use or more generally as the defendant’s “win rate.” This study focuses on the main battleground of fair use litigation—U.S. District Courts. From January 1978 through May 2011, the average defendant win rate on the issue of fair use at the district court level was 39.92%.

Defendant win rate is a reliable and valid measure of the significance of case characteristics.19 It is reliable in the sense that different researchers looking at the same data will agree whether a case was won or lost. At the risk of stating the obvious, the win rate is a valid measure of importance because, across a large number of cases, factors that are important should affect the outcomes of cases.

The empirical approach presented here differs from the more impressionistic review that legal scholars typically pursue. For example, at least some authority suggests that factors such as whether a work was creative as opposed to informational, or whether the defendant was engaged in a commercial use, are important in deciding fair use cases. This study indicates that these factors do not, in fact, have any significant influence on case

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18 The data is available on the author’s website, www.matthewsag.net.
outcomes. Because these factors do not appear to affect case outcomes in the aggregate, the conclusion is drawn that they are unimportant. I do not attempt to make a subjective assessment of the importance of the factor based on judicial discussions in individual cases. This could be viewed as a limitation, because it is always possible that in individual cases, certain factors will be important but will nonetheless fail to correlate with the case outcome. However, this lack of subjective analysis is exactly what makes this study worthwhile: there is already an abundance of law review articles filled with subjective accounts of what judges and academics say is important. Rather than adding yet another subjective account, the aim of this study is to test those assertions and intuitions objectively.

III. THEORY, DOCTRINE, AND TESTABLE HYPOTHESES

This Part reviews the extensive academic and judicial discussion of various aspects of fair use and demonstrates how abstract doctrinal propositions can be reduced to empirically testable hypotheses. Part III.A focuses on the statutory expression of the fair use doctrine in section 107 of the Copyright Act. It establishes the linkage between the four broad statutory factors set out in section 107 and the seven separate hypotheses which are then tested in Part IV. The remainder of Part III considers important nonstatutory theories about fair use. Part III.B assesses the characterization of fair use as a social subsidy from copyright owners to those in need of access to copyrighted works. It explains how the subsidy view of fair use implies that fair use litigation should favor the underdog, and the various ways in which that intuition can be tested. Part III.C addresses how industry differentiation affects fair use litigation. Parts III.B and III.C generate an additional five hypotheses that are also tested in Part IV.

A. The Statutory “Fair Use Factors”

The fair use doctrine originated as a judicially crafted exception to the rights of copyright owners. It remained one of the key nonstatutory aspects of copyright law until Congress expressly incorporated it into the Copyright Act of 1976. To describe fair use as being “codified” in the 1976 Act—as people often do—is something of an overstatement. The Copyright Act does not define fair use, nor does it contain any definitive examples of particular fair uses. All that the Act offers by way of guidance is: (1) an open list of examples “such as
criticism, comment, [and] news reporting" which may or may not be fair use;\(^\text{24}\) (2) four general factors to be considered in applying the doctrine; and (3) since 1992, a minor clarification relating to the status of unpublished works.\(^\text{25}\)

The four express factors in section 107 have had a considerable effect on how issues of fair use are analyzed. Over the past thirty years, judges have increasingly relied on the four factors to frame their analysis in fair use cases. Consequently, lawyers also craft their briefs and their advice to clients around these same factors. This is not surprising; after all, the language of section 107—"the factors to be considered shall include"—indicates that consideration of the statutory factors is mandatory in determining whether the use of a work is fair.\(^\text{26}\) However, these four factors were not intended to be exclusive, nor were they intended to be so specific as to freeze judicial development of the doctrine.\(^\text{27}\)

The statutory factors are:

(1) the purpose and character of the use, including whether such use is of a commercial nature or is for nonprofit educational purposes; (2) the nature of the copyrighted work; (3) the amount and substantiality of the portion used in relation to the copyrighted work as a whole; and (4) the effect of the use upon the potential market for or value of the copyrighted work.\(^\text{28}\)

There is much more to the statutory factors than meets the eye. For example, within the broad scope of "the purpose and character of the use" in the first factor, courts take into account a variety of considerations, including whether the defendant's use was commercial and whether that use was "transformative"—a term of art in fair use jurisprudence discussed in detail below.\(^\text{29}\) Thus, in effect the first factor is really two separate factors. Under the

\(^{24}\) Id. (emphasis added); see also Harper & Row, Publishers, Inc. v. Nation Enters., 471 U.S. 539, 561 (1985) (stating that the examples enumerated in section 107 should not be regarded as "exhaustive," nor do they "single out any particular use as presumptively a 'fair' use").


\(^{26}\) See 17 U.S.C. § 107; see also Bond v. Blum, 317 F.3d 385, 394 (4th Cir. 2003) (The factors represent "only general guidance about the sorts of copying that courts and Congress most commonly have found to be fair uses." (internal quotation marks omitted)); Universal City Studios, Inc. v. Sony Corp. of Am., 480 F. Supp. 429, 448 (C.D. Cal. 1979) ("The factors are illustrative, not definitive.").


\(^{29}\) A work is considered to be a transformative work if it imbues the original "with a further purpose or different character, altering the first with new expression, meaning, or message." Campbell v. Acuff-Rose Music, Inc., 510 U.S. 569, 579 (1994); see infra notes
umbrella of the second factor, "the nature of the copyrighted work," courts explore two quite separate considerations: the creativity of the plaintiff's work and whether it was published. The third factor, "the amount and substantiality of the portion used in relation to the copyrighted work as a whole," is refreshingly self-descriptive. Under this factor, courts essentially evaluate how much the defendant is alleged to have taken and how important that taking was in the context of the plaintiff's work. The fourth factor focuses on the market effect of the defendant's conduct: it might be the most important factor, or it might be no factor at all.

This section explores these factors in detail and proposes specific testable hypotheses in relation to each.

1. The "Purpose and Character of the Use" and Transformative Use

The phrase "transformative use" has loomed large in fair use jurisprudence ever since the Supreme Court embraced transformativeness as the heart of fair use in its 1994 Campbell decision. The key issue in Campbell was the extent of permissible copying in the context of musical parody. According to the Court, parody is a form of transformative use and "provide[s] social benefit, by shedding light on an earlier work, and, in the process, creating a new one." The Court argued that the creation of transformative works, although not necessary in every case, lies "at the heart of the fair use doctrine's guarantee of breathing space within the confines of copyright." According to Campbell, transformativeness not only occupies the core of the fair use doctrine but also reduces the importance of all other factors such that "the more transformative the new work, the less will be the significance of other factors, like commercialism, that may weigh against a finding of fair use."

To begin to understand transformative use, one must understand how a transformative work differs from a "derivative work"—another important term of art in copyright law. Section 106(2) of the Copyright Act gives copyright owners an exclusive right to prepare derivative works based on the copyright owner's original work. As defined in the statute, a derivative work takes a

41–43 and accompanying text (addressing the distinction between transformative uses and derivative works); infra Part III.A.1 (in relation to transformative use); infra Part III.A.2 (in relation to commercial use).

30 See infra Part III.A.3.
31 See infra Part III.A.4.
32 See infra Part III.A.5.
33 Campbell, 510 U.S. at 579 (citing Leval, supra note 12, at 1111).
34 Id. at 571–72.
35 Id. at 579.
36 Id.
37 Id.
preexisting work and "recast[s], transform[s], or adapt[s]" that work.\textsuperscript{39} The kind of transformations referred to here are not necessarily "transformative" as that term was intended by the Supreme Court in the context of fair use.\textsuperscript{40} A transformative work, in the fair use sense, is one that imbues the original "with a further purpose or different character, altering the first with new expression, meaning, or message."\textsuperscript{41} Thus, the assessment of transformativeness is not merely a question of the degree of difference between two works; rather, it requires a judgment of the motivation and meaning of those differences. The difference between a noninfringing transformative use and an infringing derivative work can be illustrated as follows: if \textit{Pride and Prejudice} were still subject to copyright protection, the novel \textit{Pride and Prejudice and Zombies}, which combines Jane Austen's original work with scenes involving zombies, cannibalism, and ninjas, would be considered a transformative parody of the original, and thus fair use rather than infringement.\textsuperscript{42} In contrast, a more traditional sequel would merely be an infringing derivative work.\textsuperscript{43}

In the wake of \textit{Campbell}, lower courts have arguably muddied the definition of transformative use by applying the label to a wide range of uses beyond parody. Substantial copying of a novel in the service of criticism was regarded as transformative in \textit{Suntrust Bank v. Houghton Mifflin Co.},\textsuperscript{44} as was copying to create a new work of art with no obvious critical element in \textit{Blanch v. Koons}.\textsuperscript{45} Copying without modification was regarded as transformative in \textit{Savage v. Council on American-Islamic Relations, Inc.}, where the Islamic organization copied and distributed anti-Islamic statements made by Michael Savage as part of a fundraising exercise.\textsuperscript{46} Recontextualization without modification from one expressive context to another was seen as transformative in \textit{Bill Graham Archives v. Dorling Kindersley Ltd.}\textsuperscript{47} In addition to these cases,

\begin{itemize}
  \item \textsuperscript{39} \textit{Id.} § 101 (emphasis added) (defining derivative work).
  \item \textsuperscript{40} A different term expressing the same concept would have been more helpful.
  \item \textsuperscript{41} \textit{Campbell}, 510 U.S. at 579.
  \item \textsuperscript{42} The example is analogous to \textit{Suntrust Bank v. Houghton Mifflin Co.}, 268 F.3d 1257, 1276 (11th Cir. 2001).
  \item \textsuperscript{43} For an example, see \textsc{Linda Berdoll, Mr. Darcy Takes A Wife: Pride and Prejudice Continues} (2004).
  \item \textsuperscript{44} 268 F.3d at 1269–71.
  \item \textsuperscript{45} 467 F.3d 244, 253 (2d Cir. 2006).
  \item \textsuperscript{46} No. C 07-6076 SI, 2008 WL 2951281, at *9 (N.D. Cal. July 25, 2008); \textit{see also} Hustler Magazine, Inc. v. Moral Majority, Inc., 796 F.2d 1148, 1153 (9th Cir. 1986) ("[A]n individual in rebutting a copyrighted work containing derogatory information about himself may copy such parts of the work as are necessary to permit understandable comment.").
  \item \textsuperscript{47} 448 F.3d 605, 609–10 (2d Cir. 2006) (use of promotional posters in a rock biography was "a purpose separate and distinct from the original artistic and promotional purpose for which the images were created"); \textit{see also} Mattel Inc. v. Walking Mountain Prods., 353 F.3d 792, 796–98, 800–06 (9th Cir. 2003) (concluding that photos parodying Barbie by depicting "nude Barbie dolls juxtaposed with vintage kitchen appliances" were fair use).
\end{itemize}
courts have also found a number of nonexpressive uses to be transformative. In particular, several cases have held that automated processing and display of copyrighted photos as part of a visual search engine is a transformative and thus a fair use. This varied application makes a precise definition of transformative difficult.

Moreover, it has been argued that applying the designation of "transformative use" to contexts where the original copyrighted work has not actually been altered renders the term meaningless, or at least hopelessly imprecise. David Nimmer suggests that in the hands of some judges, transformative use has no content at all and that it is simply synonymous with a finding of fair use. According to Samuelson, a better approach would be to distinguish transformative critiques, such as parodies, from productive uses for critical commentary. Samuelson also suggests that courts should not label orthogonal uses—uses wholly unrelated to the use made or envisaged by the original author—as transformative uses. In a similar vein, I have argued in a previous article that the term transformative use should be confined to expressive uses of copyrighted works and that nonexpressive use should be recognized as a distinct category of preferred use. Despite these sensible criticisms and suggestions, it is likely that lower courts will continue to apply the label of transformative use to any use they think ultimately fair, as long as a finding of transformativeness is perceived to be necessary to avoid the presumption of market harm attaching to commercial uses.

This murkiness is a useful reminder of how cautious we have to be in taking judicial conclusions as facts in any particular case and reinforces the necessity of finding objectively verifiable measures for empirical analysis. If transformative use has indeed become synonymous with fair use, there can be no empirical measure of transformative use. However, taking the concept of

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48 For a full discussion of the application of the fair use doctrine to automated and nonexpressive uses, see Sag, supra note 11, at 1610–24, 1645–56.

49 Perfect 10, Inc. v. Amazon.com, Inc., 508 F.3d 1146, 1168 (9th Cir. 2007); Kelly v. Arriba Soft Corp., 336 F.3d 811, 822 (9th Cir. 2003); see also A.V. ex rel. Vanderhye v. iParadigms, LLC, 562 F.3d 630, 645 (4th Cir. 2009) (finding that the automated processing of the plaintiff students' work in defendant's plagiarism-detection software was fair use).

50 4 MELVILLE B. NIMMER & DAVID NIMMER, NIMMER ON COPYRIGHT § 13.05[A][1][b] (2011) (Those Second Circuit cases "appear to label a use 'not transformative' as a shorthand for 'not fair,' and correlatively 'transformative' for 'fair.' Such a strategy empties the term of meaning—for the 'transformative' moniker to guide, rather than follow, the fair use analysis, it must amount to more than a conclusory label.").

51 Id.

52 Samuelson, supra note 17, at 2557 ("Although Campbell defines 'transformative' in a way that encompasses uses for different purposes, copyright law will be more comprehensible and coherent if iterative copying for orthogonal purposes is distinguished from truly transformative uses of prior works.").

53 Sag, supra note 11, at 1647.

54 This doctrinal morass could have been avoided if the Supreme Court had more clearly rejected the presumption against commercial fair use in Campbell.
transformativeness at its most literal level makes it possible to test at least one of the core meanings of the term. To the extent that transformative use means making a new work out of an old one, then it stands to reason that stark differences between the work allegedly copied and the defendant’s work should be indicative of transformation. This general concept is operationalized by the variable Creativity Shift. In cases where the plaintiff’s work is creative and the defendant’s is informational, or vice versa, Creativity Shift is set to 1. In such cases, the defendant has not just created a new work, she has also created a work in a different category. This shift in category should almost always entail a fundamental change in purpose, which is the hallmark of transformative use. The testable implication arising from transformative use is then:

\[ H1 \quad \text{Creativity Shift makes a finding of fair use more likely.} \]

This hypothesis does not completely encapsulate every sphere of meaning ascribed to transformative use, but it clearly captures at least one substantial aspect of the concept.

2. The “Purpose and Character of the Use” and Commercial Use

The status of commercial fair use leaves many law students, lawyers, and judges perplexed. The first statutory factor expressly invites consideration of whether the defendant’s use “is of a commercial nature or is for nonprofit educational purposes.” In Sony Corp. of America v. Universal City Studios, Inc., the Supreme Court went so far as to declare that “every commercial use of copyrighted material is presumptively an unfair exploitation.” This much would seem to suggest a clear rule: commercial use is not fair use. Likewise, it suggests a clear hypothesis:

\[ H2 \quad \text{Commercial use by the defendant makes a finding of fair use less likely.} \]

However, Sony is not the final word on commercial use. As the Supreme Court later acknowledged in Campbell v. Acuff-Rose Music, Inc., the Sony presumption against commercial uses “would swallow nearly all of the

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55 All variables referred to in the text are summarized in the Statistical Appendix, infra.
56 Creativity Shift is set to 0 in every other case.
57 17 U.S.C. § 107(1) (2006). This supposed distinction itself is bewildering as educational uses have often been denied fair use protection, and there are many noncommercial uses that have nothing to do with education.
illustrative uses listed in the preamble paragraph of section 107, including news reporting, comment, criticism, teaching, scholarship, and research, since these activities are generally conducted for profit." In *Campbell*, the Supreme Court rejected the notion that commerciality by itself had any "hard presumptive significance." Instead, the Court adopted a sliding scale in which the transformativeness of the defendant's use dominates other factors, such as commercialism. As a result, the relevance of commercial use is contingent on the transformative nature of the defendant's use. The implication here is an alternative to H2:

\[ H2^* \quad \text{Untransformative commercial uses are less likely to be fair uses.} \]

This still leaves the question of how to measure commerciality in particular cases. Part of the confusion about commercial fair use stems from a failure to distinguish between commercial uses and uses by commercial actors. Lawyers with limited copyright experience often reflexively suggest that the status of the defendant as a for-profit entity makes fair use unavailable as a defense to copyright infringement. However, a presumption against commercial actors has no foundation in the statute, which focuses on the character of the "use," not the identity of the user. Discrimination against commercial actors is also inconsistent with the basic economic logic of copyright—copyright creates private incentives to encourage the creation of expressive works; for those incentives to be effective necessarily presupposes commercial exploitation. Put simply, if copyright assumes that "[n]o man but a blockhead ever wrote, except for money," then it makes very little sense to deny the nonblockheads the protection of the fair use doctrine.

Recent cases have suggested that a better understanding of commercial use focuses not on the identity of the user, but on the substitution effect of the unauthorized copying. In *A & M Records, Inc. v. Napster, Inc.*, for example, the district court determined that users who downloaded copyrighted music via a free Internet file-sharing service were engaged in a commercial use because, by distributing music files, "Napster users get for free something they would

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59 510 U.S. 569, 584 (1994) (internal quotation marks omitted).
60 *Id.* at 585.
61 *Id.* at 579.
63 Eldred v. Ashcroft, 537 U.S. 186, 219 (2003) (Copyright promotes the creation and dissemination of expression "[b]y establishing a marketable right to the use of one's expression." (citing *Harper & Row*, 471 U.S. at 558)).
64 See *Sag*, supra note 11, at 1648.
65 See *Campbell*, 510 U.S. at 584 (alteration in original) (quoting 3 JAMES BOSWELL, *THE LIFE OF SAMUEL JOHNSON*, LL.D. 19 (George Birkbeck Hill ed., Clarendon Press 1934) (1791)).
ordinarily have to buy.66 Defining commerciality in this way is consistent with the essential purpose of copyright law: creating market incentives by protecting creators of original expression from certain types of substitution, primarily expressive substitution.67 However, this construction of commerciality is almost exactly equivalent to the concept of market effect under the fourth factor, so employing it here would be double counting to say the least.68

If commercial use is an independent factor that predicts the outcomes of fair use cases, it must mean something analytically distinct from market effect. In his recent analysis of the contents of fair use opinions, Beebe found that although 84% of opinions address the issue of commerciality, the subfactor appears to have no significant influence on case outcomes.69 Beebe relies on ex post judicial assessments of whether a use is commercial. In contrast, this study sets aside such after-the-fact categorizations because they tell us nothing about the ex ante predictability of fair use. This is an important difference because the designation of “commercial use” in fair use cases sometimes confounds common sense understandings of what is, and is not, commercial. The *Oxford English Dictionary* defines the adjective “commercial” as “[e]ngaged in commerce; trading,”70 with “commerce” defined as “[e]xchange between men of the products of nature or art; buying and selling together; trading; exchange of merchandise, esp. as conducted on a large scale between different countries or districts; including the whole of the transactions, arrangements, etc., therein involved.”71 On the other hand, case law tells us that even in the absence of exchange, the free file sharing of copyrighted music is commercial,72 and that the free dissemination of a religious book by a dissident church “unquestionably profits” that church and is thus tantamount to commercial.73

66 114 F. Supp. 2d 896, 912 (N.D. Cal. 2000); see also Harper & Row, 471 U.S. at 562 (“The crux of the profit/nonprofit distinction is not whether the sole motive of the use is monetary gain but whether the user stands to profit from exploitation of the copyrighted material without paying the customary price.”); Am. Geophysical Union v. Texaco Inc., 60 F.3d 913, 922 (2d Cir. 1994) (concluding that researchers at a for-profit laboratory gained an indirect economic advantage by photocopying copyrighted scholarly articles).

67 See Sag, *supra* note 11, at 1630 (arguing that a number of copyright doctrines converge around the idea that a subsequent author should be free to compete using her own expression of facts, concepts, and ideas originating with prior authors, but not by offering an original author’s own expression to the public).

68 See infra Part III.A.5.


70 3 OXFORD ENGLISH DICTIONARY 552 (2d ed. 1989).

71 Id.


This study distinguishes between noncommercial and commercial uses as those terms would likely be understood by potential litigants. The category of noncommercial use includes: (1) personal uses, such as time-shifting broadcast television; (2) educational uses, where the defendant’s use of the plaintiff’s work was related to some kind of formal education at a recognized educational institution; (3) research uses, where the defendant’s use was for the purpose of general research and was not part of a specific product development process; and (4) activities such as peer-to-peer file sharing that communicate the plaintiff’s work (or some derivative thereof) to the public, but without direct or indirect commercial benefit. The defendant’s use is categorized as “commercial” if the defendant used the plaintiff’s work as part of a commercial product or service or as an intermediate step to creating a commercial product or service.

To take account of the potential interaction of commercial use with transformative use, I coded a separate variable to distinguish between direct and indirect commercial exploitation. Any use of the plaintiff’s copyrighted work in a product or service sold to the public was classified as direct commercial exploitation unless: (1) the work was only used or copied as part of an intermediate process; or (2) the defendant had taken an extra step, applying its own labor or creativity to somehow change the original copyrighted work. However, the addition of new material that left the original copyrighted work basically the same was not treated as involving an extra step. Thus, for the purposes of this study, H3 can be restated as:

\[ H3 \quad \text{Direct Commercial Use is less likely to be found to be fair use.} \]

3. The Nature of the Work

The next fair use factor instructs courts to consider “the nature of the copyrighted work.” Over the past thirty years, courts have typically distilled the amorphous “nature” of the work into two more tractable considerations: whether the plaintiff’s work is creative as opposed to informational; and whether the work is unpublished, as opposed to published.

Several prominent fair use cases from 1985 to 1992 indicated that the fair use doctrine has no application where the plaintiff’s work was unpublished. In 1985, a majority of the Supreme Court declared in *Harper & Row, Publishers*,

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74 This distinction does not disregard the relevance of market substitution but merely relegates it to its proper place under the fourth factor.
76 See, e.g., *Leadsinger, Inc. v. BMG Music Publ’g*, 512 F.3d 522, 531 (9th Cir. 2007) (describing song lyrics as “a work of creative expression, as opposed to an informational work, which is precisely the sort of expression that the copyright law aims to protect” (emphasis added)).
Inc. v. Nation Enterprises that “[u]nder ordinary circumstances, the author’s right to control the first public appearance of his undisseminated expression will outweigh a claim of fair use.” This ruling was followed and expanded in a series of cases in the Second Circuit. However, in 1992, the force of this subfactor was blunted by an amendment to section 107, adding the following to the statutory description of fair use: “The fact that a work is unpublished shall not itself bar a finding of fair use if such finding is made upon consideration of all the above factors.” Nevertheless, it is appropriate to test the hypothesis:

\[ H4 \text{ A finding of fair use is less likely where the plaintiff's work is unpublished.} \]

A second aspect of the nature of the work is that, in principle, the more creative the original work is, the more justification is required to establish a claim of fair use. As the Campbell Court explained, “[s]ome works are closer to the core of intended copyright protection than others, with the consequence that fair use is more difficult to establish when the former works are copied.” Accordingly, the second factor presents another hypothesis:

\[ H5 \text{ A finding of fair use is less likely where the plaintiff's work is creative.} \]

4. Amount Copied

The next statutory fair use factor is “the amount and substantiality of the portion used in relation to the copyrighted work as a whole.” The application of this factor is inherently bound up in the first and fourth factors: the extent of permissible copying varies according to the purpose of the copying and the

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78 Id. at 555.
79 See Wright v. Warner Books, Inc., 953 F.2d 731, 737 (2d Cir. 1991) (stating that “[u]npublished works are the favorite sons of factor two” and that “[o]ur precedents... leave little room for discussion of this factor once it has been determined that the copyrighted work is unpublished”); New Era Publ’ns Int’l v. Henry Holt & Co., 873 F.2d 576, 583 (2d Cir. 1989) (“Where use is made of materials of an ‘unpublished nature,’ the second fair use factor has yet to be applied in favor of an infringer, and we do not do so here.”); Salinger v. Random House, Inc., 811 F.2d 90, 97 (2d Cir. 1987) (holding that “unpublished works ... normally enjoy complete protection against copying any protected expression”).
82 Id.
effect of the copying on the rightsholder. Accordingly, the third factor is usually said to be both qualitative and quantitative.

The contextual element in the third factor makes it challenging to reduce to a simple empirical question. There is, however, a reasonably objective distinction that illuminates the role played by this factor. In most cases it is easy to distinguish between a defendant accused of making a complete copy of the plaintiff’s work and one who is accused of making only a partial copy. Thus, the relevant hypothesis in relation to the third factor is:

\[ H_6 \text{ A finding of fair use is more likely where the defendant uses only part of the plaintiff’s work.} \]

5. Market Effect

The final statutory factor is “the effect of the use upon the potential market for or value of the copyrighted work.” Although the Supreme Court once commented that this factor is “undoubtedly the single most important element of fair use,” subsequent cases have retreated from that position. In its most recent fair use decision, *Campbell v. Acuff-Rose Music, Inc.*, the Supreme Court notably failed to stress the market effect factor; it insisted instead that “[a]ll [statutory factors] are to be explored, and the results weighed together, in light of the purposes of copyright.”

In his investigation, Beebe noted that of the 141 judgments finding that the market-effect factor disfavored the defendant, all but one also ruled against the defendant on the ultimate issue of fair use. Finding a 99% correlation in an empirical study is a bit like finding that 99% of Iraqis voted for Saddam Hussein—it is a statistic so impressive that it engenders disbelief. Although market effect has the ring of an objective factual investigation, it is in fact a highly subjective assessment. In most cases, the judgment as to whether the defendant’s conduct falls foul of the fourth factor is somewhat elastic because to ascertain the extent of potential market effect, courts must first determine whether a given use is within the potential market. The proper scope of the plaintiff’s current and future copyright markets is thus an input, throughput, and output of this analytical process. In light of this imprecision, the apparent

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84 *Campbell*, 510 U.S. at 587.
87 *Harper & Row*, 471 U.S. at 566.
88 *Campbell*, 510 U.S. at 578.
symmetry between the way judges describe the fourth factor and the outcomes of fair use cases raises the suspicion that market effect is no factor at all.\(^9\)

The question then becomes: Is there any empirical content to the fourth statutory factor, or is it merely a legal conclusion? The simplest way to understand the market-effect factor is as an inquiry into competitive injury or lost sales. Conceived as such, the empirical question is just a matter of finding that injury or those lost sales. This inquiry is easy to conceive but harder to implement because the extent of past losses and probable extent of future losses are keenly contested elements in most fair use trials.

Although it is hard to verify the likely extent of market interference in any particular case, it seems intuitive that the likelihood of competitive injury increases when the plaintiff and defendant are in the same industry. To analyze this issue, each plaintiff and defendant in the dataset was assigned an industry classification based on the North American Industry Classification System (NAICS).\(^9\) This data was then used to generate an Industry Separation dummy variable (a variable that is either 0 or 1) indicating whether plaintiff and defendant were in the same industry (Industry Separation = 0) or not (Industry Separation = 1).\(^9\) The testable hypothesis relating to market effect is:

\[
H7 \quad \text{Industry Separation makes a finding of fair use more likely.}
\]

This section has established the motivation for several testable propositions in relation to the statutory fair use factors and the various subfactors that have emerged from the case law over the past thirty years. The remainder of this Part explores additional theories about fair use which are less closely tied to the statutory text.

B. Does Fair Use Favor the Underdog?

Both judges and academics have characterized the fair use doctrine as a redistributive tool favoring the politically and economically disadvantaged. For example, in *Sony Corp. of America v. Universal City Studios, Inc.*, Justice Blackmun characterized the fair use doctrine as "a form of subsidy" at the

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\(^9\) See Beebe, *supra* note 16, at 620–21 (reaching the same conclusion).


\(^9\) For the purpose of measuring Industry Separation, I used two-digit NAICS codes.
expense of authors that permits limited use of a work "for the public good."\textsuperscript{95} A number of scholars have also emphasized the function of fair use in redistributing value from copyright owners to "preferred classes of users."\textsuperscript{96} This characterization is not neutral, it reflects a skeptical or grudging view of fair use. After all, subsidies are treated with great skepticism in a free market economy, and so the subsidy view of fair use naturally suggests that the doctrine's benefits should be reserved for the truly deserving, if not eliminated altogether.\textsuperscript{97}

What is the foundation for this view? There is an intuition that fair use is some kind of social subsidy favoring underdog defendants—defendants who lack status, power and money, particularly compared to their litigation opponents. This underdog view of fair use arises, in part, from the focus of the statutory examples on activities "such as criticism, comment, news reporting, teaching, . . . scholarship, [and] research."\textsuperscript{98} It also stems from the distinction between uses made for "nonprofit educational purposes" and those of a "commercial nature" found in the first fair use factor.\textsuperscript{99}


\textsuperscript{96} Jane C. Ginsburg, Authors and Users in Copyright, 45 J. COPYRIGHT SOC'Y U.S.A. 1, 15 (1997) (emphasizing the "redistribution" of value from copyright owners to preferred classes of users); Jane C. Ginsburg, Copyright, Common Law, and Sui Generis Protection of Databases in the United States and Abroad, 66 U. CIN. L. REV. 151, 169 (1997) (viewing fair use as subsidy from copyright owner in favor of uses with public benefits); see also 2 PAUL GOLDSTEIN, GOLDSTEIN ON COPYRIGHT § 12.2.2.1(a) (Supp. 2011) (observing that the "commercial-noncommercial distinction" in fair use can be characterized as "a covert subsidy to worthy nonprofit enterprises such as schools and universities"); Robert P. Merges, The End of Friction? Property Rights and Contract in the "Newtonian" World of On-Line Commerce, 12 BERKELEY TECH. L.J. 115, 135 (1997) (characterizing fair use as a tax on copyright owners and a subsidy in favor of certain classes of users).

\textsuperscript{97} See, e.g., LEE WILSON, FAIR USE, FREE USE AND USE BY PERMISSION: HOW TO HANDLE COPYRIGHTS IN ALL MEDIA 67 (2005) ("Fair use is a kind of public policy exception to the usual standard for determining copyright infringement"; fair use requires a "countervailing public interest . . . [that] typically creates some social, cultural or political benefit."); NII Copyright Protection Act of 1995: Hearings on H.R. 2441 Before the Subcomm. on Courts and Intellectual Property of the H. Comm. on the Judiciary, 104th Cong. 75 (1996) (statement of Barbara A. Munder, Senior Vice President of the McGraw-Hill Companies and Chair of the Information Industry Association Board of Directors) (arguing that the burden of subsidizing access "is a broader societal responsibility, not one that should be borne primarily—let alone exclusively—by copyright owners"). Of course, many commentators resist the label of subsidy precisely because once fair use is identified as such it becomes easier to argue for its elimination. See Yochai Benkler, Free as the Air to Common Use: First Amendment Constraints on Enclosure of the Public Domain, 74 N.Y.U. L. REV. 354, 363 (1999) (arguing that "the public domain is not a 'subsidy to users'"").


\textsuperscript{99} Id. § 107(1).
Furthermore, the intuition that fair use favors the underdog can also be traced to the predominant law and economics account. In her influential 1982 article, *Fair Use as Market Failure*, Wendy Gordon argued that fair use should be understood as a doctrine justifying unauthorized copying in instances of market failure in general, and high transaction costs in particular. Fair use has commonly been found in situations where the cost of collecting a license fee would exceed the license fee itself. This view is easy to reconcile with the statutory text: the fourth fair use factor considers the “effect of the use upon the potential market for or value of the copyrighted work”—there is no market effect where there is no effective market. Accordingly, the market-failure view leads to a preference for the underdog because an underdog’s failure to pay the customary price for a particular copy of a work is less likely to adversely affect the copyright’s broader market. The underdog is also, in general, a less concentrated interest, and thus the transaction costs of collecting royalties are likely to be higher, so it is more likely that the costs of collection would exceed potential revenue.

Testing the doctrinal intuition that fair use favors the underdog involves reducing that general proposition to something more concrete. Although litigants do not come to court with the labels “underdog” and “overdog” stamped across their foreheads, there is a well-developed literature exploring the divergent experience of the “haves” and “have-nots” in litigation. This study borrows extensively from this literature to suggest appropriate measures of underdog status.

1. Legal Personality as a Measure of Underdog Status

Overdogs and underdogs are conventionally defined in terms of status, power, and resources. In studies of Supreme Court decision making, it is commonplace to classify governments and corporations as overdogs because they are presumed to have more resources and higher status and, for similar reasons, to classify individuals as underdogs. Although it is possible to

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100 Gordon, *supra* note 95, at 1627–35 (arguing that fair use exception to the exclusive rights of copyright can only be justified by the presence of market barriers such as high transaction costs, externalities, nonmonetizable benefits, or antidissemination motives); see also Lydia Pallas Loren, *Redefining the Market Failure Approach to Fair Use in an Era of Copyright Permission Systems*, 5 J. INTELL. PROP. L. 1, 48–56 (1997) (focusing on externalities).

101 See *Ty, Inc. v. Publ'ns Int’l Ltd.*, 292 F.3d 512, 518 (7th Cir. 2002) (Posner, J.).


104 *Id.* at 97.

105 See, e.g., S. Sidney Ulmer, *Selecting Cases for Supreme Court Review: An Underdog Model*, 72 AM. POL. SCI. REV. 902, 903 (1978) (examining litigant status as an independent variable in Supreme Court decision making and finding that liberal justices supported underdogs and conservative justices supported upperdogs).
measure status and empowerment in many different ways, one of the most common approaches is to reduce the question to legal personality: i.e., whether a party is an organization or an individual natural person. One of the pioneers of this field, Marc Galanter, argues that the well-resourced repeat players are almost always organizations. Consequently, the superiority of the “haves” over the “have-nots” can be tested simply by comparing the fortunes of organizations, businesses, and government bodies against individual natural persons. There is a large body of evidence to suggest that overdogs are indeed advantaged by their superior financial resources, their greater experience with the legal system, and their ability to strategically settle unfavorable cases.

In general, the evidence suggests “that organizations do better than individuals in almost every kind of litigation, at almost every stage, and as both plaintiffs and defendants.” For example, in a study of the success of appellants before selected U.S. Courts of Appeals, Donald Songer and Reginald Sheehan found that “[t]he success rates of appellants consistently increase with each incremental increase in their strength relative to the strength of the respondent.” Accordingly, the notion that fair use favors the underdog leads to the testable implication that:

\[ H_8 \text{ A finding of fair use is more likely if the defendant is a natural person.} \]

Unfortunately, at least from an empiricist’s perspective, the doctrinal intuition that fair use favors the underdog cuts against the obvious and well-established disadvantages of the underdog in litigation. The litigation literature establishes a

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107 See id.

108 Id.

109 Id. at 1389–98.

110 Id. at 1389; see also Terence Dunworth & Joel Rogers, Corporations in Court: Big Business Litigation in U.S. Federal Courts, 1971–1991, 21 Law & Soc’y Inquiry 497, 557 (1996) (finding a 17 percentage point success gap in favor of Fortune 2000 companies as plaintiffs in federal cases and 29 percentage point success gap as defendants); Theodore Eisenberg & Henry S. Farber, The Litigious Plaintiff Hypothesis: Case Selection and Resolution, 28 RAND J. Econ. 92, 99, S101 (1997) (finding a success gap for corporate plaintiffs versus individual plaintiffs of 23 percentage points in federal diversity cases not including personal injury cases).

strong prior that, compared to corporate entities, natural persons will fare badly in litigation. I address this issue in more detail in Part IV below.

2. Legal Representation as a Measure of Underdog Status

Based on the intuition that underdogs would not have the same access to legal services as overdogs, the characteristics of the parties' attorneys and law firms may provide another measure of empowerment. I cross-referenced court records with the widely used Martindale-Hubbell directory to determine experience ratings for the individual attorneys and law firms in each case. The variables used in this analysis relate to the Martindale-Hubbell “AV” ranking for attorneys and law firms. An AV ranking indicates that the lawyer (or firm) in question received an average rating of 4.5 or above out of 5 and is regarded as “preeminent” by his or her peers. Only 40% of plaintiffs and 51% of defendants retained as their principal representative an attorney with the highest possible Martindale-Hubbell rankings. A preference for acclaimed experience was more apparent in the selection of law firms: 81% of plaintiffs and 77% of defendants chose law firms with the highest possible Martindale-Hubbell rating.

Comparing the representation of both sides in each case, I generated dummy variables to indicate those cases where the plaintiff availed itself of AV-rated lawyers (or law firms) and the defendant did not. It is important to stress that these measures are comparative. The hypothesis here is that if fair use favors the underdog defendant, those defendants who retain less experienced attorneys and law firms than their opponents will actually be more likely to be advantaged by the application of the doctrine. This implies two related hypotheses:

\[ H9 \] If the defendant is an underdog in terms of attorney representation, a finding of fair use is more likely; and

\[ H10 \] If the defendant is an underdog in terms of law firm representation, a finding of fair use is more likely.

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113 Id. According to Martindale-Hubbell, their Peer Review Ratings evaluate lawyers in the United States and Canada based on the anonymous opinions of members of the bar and the judiciary. Id. Attorneys with less than three years' experience are unlikely to have a Martindale-Hubbell rating because the company usually conducts its first review three years after bar admission. See id. Attorneys with an average score of 4.5 to 5 out of 5 receive an "AV" or "Preeminent" rating, which, according to Martindale-Hubbell, is a "testament to the fact that a lawyer's peers rank him or her at the highest level of professional excellence." Id.

114 The plaintiff/defendant correlations for attorney ratings and firm ratings were quite low: .13 and .06 respectively. This data was not available for analysis for the years between 2007 and 2011 at the time of writing.
As before, these hypotheses contradict the general expectation that higher-rated lawyers and more prestigious law firms should ordinarily obtain superior results for their clients.\textsuperscript{115} Although the intuition that better lawyers will produce more favorable outcomes is both obvious and appealing, there is surprisingly little evidence to that effect. Most importantly for this study, it is not clear that lawyer prestige translates to lawyer quality as measured in case outcomes. For example, in a recent study of public defenders randomly assigned to felony cases in Nevada, David Abrams and Albert Yoon conclude that more experienced lawyers produced better outcomes, but the authors did not find any significant differences in sentencing based on the attorney’s legal educational background.\textsuperscript{116} More generally, Haire, Lindquist, and Hartley find only mixed support for the proposition that attorney expertise influences litigant success in civil cases.\textsuperscript{117} Thus, although one might expect attorney and firm ratings to show a positive correlation with litigation outcomes, the extant literature suggests this can only be a weakly held prior.

C. Industry Effects

Dan Burk and Mark Lemley have made a strong case for the importance of industry variation in patent law.\textsuperscript{118} It stands to reason that a similar phenomenon might apply in copyright law. The same NAICS data used to generate the industry separation variable referred to above can also be used to chart industry differences in fair use litigation.\textsuperscript{119}

\textsuperscript{115} Another issue to consider is that the selection of lawyers and law firms in the dataset is not the product of random assignment. The parties decide how much to invest in legal services based on their anticipation of the risks and rewards of litigation and their own perceptions of the incremental advantage that can be obtained by retaining more experienced counsel. There is no obvious way to control for the endogeneity of these factors. See generally Stanton Wheeler et al., Do the "Haves" Come Out Ahead? Winning and Losing in State Supreme Courts, 1870–1970, 21 LAW & SOC’Y REV. 403 (1987) (comparing solo practitioners to lawyers practicing in firms and partnerships in state supreme court cases and finding that stronger parties tended to retain attorneys affiliated with a firm and that clients represented by firms fared better).

\textsuperscript{116} David S. Abrams & Albert H. Yoon, The Luck of the Draw: Using Random Case Assignment to Investigate Attorney Ability, 74 U. CHI. L. REV. 1145, 1168 (2007). A defendant assigned to an attorney in the top 10% of experience had an average incarceration rate 14 percentage points lower than one with an attorney in the bottom 10%. Id. at 1173. A similar comparison of expected sentence length yields an expected sentence reduction of 1.2 months, simply due to the experience of the randomly assigned attorney. Id. at 1170.


\textsuperscript{119} See supra note 93 and accompanying text.
As seen in Figures 1 and 2 (below), for both plaintiffs and defendants, the "Information" industries dominate fair use litigation (41% and 52%, respectively). In the NAICS coding scheme, the "Information" category includes publishing, sound recording, motion pictures, telecommunications, radio, satellite, television, data processing, and libraries and archives. For defendants, no other category accounts for more than 10% of the population; whereas, not surprisingly, the "Arts, Entertainment and Recreation" group accounts for 20% of plaintiffs.

Figure 1: Plaintiff Industries (Major Categories)

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121 The "Arts, Entertainment and Recreation" category, NAICS codes 711110 to 713990, includes theatre companies, dance companies, music groups, sports teams, promoters of performing arts, sports, and similar events, independent artists, writers, and performers as well as museums, zoos, amusement parks, casinos, golf courses, and other amusement or recreational facilities. 2007 NAICS Definition, U.S. CENSUS BUREAU, http://www.census.gov/cgi-bin/sssd/naics/naicsrch?chart_code=71&search=2007 NAICS Search (last visited Feb. 24, 2012).
The population in this study is too small to test the significance of individual industries on fair use outcomes; however, it is possible to test the more general hypothesis that the Industry Group variable will be a significant factor in fair use outcomes. Accordingly, the final two hypotheses are:

\[ H_{11} \text{ Plaintiff Industry Group is a significant factor in fair use outcomes; and} \]

\[ H_{12} \text{ Defendant Industry Group is a significant factor in fair use outcomes.} \]

Even if Industry Group does not turn out to be significant, it is important to include some measure of industry effects in the regression model as a control variable in order to reduce the chances that effects observed in relation to other variables are not simply a product of unobserved characteristics associated with either plaintiff or defendant. Including Industry Group in the analysis does not preclude this possibility, but it goes some way toward minimizing it.
IV. RESULTS

A. Overview of Results

The previous Part demonstrated how substantial doctrinal questions relating to fair use can be translated into three clusters of testable hypotheses. This Part presents the results of the empirical analysis in both tabular and graphical form.

To review, the first cluster of testable hypotheses consists of implications arising directly from the four statutory fair use factors:

H1 Creativity Shift makes a finding of fair use more likely;

H2 Commercial use by the defendant makes a finding of fair use less likely;

H3 Direct Commercial Use makes a finding of fair use less likely;

H4 A finding of fair use is less likely where the plaintiff's work is unpublished;

H5 A finding of fair use is less likely where the plaintiff's work is creative;

H6 A finding of fair use is more likely where the defendant uses only part of the plaintiff's work; and

H7 Industry Separation makes a finding of fair use more likely.

The second group of propositions relates less directly to the statutory text of section 107. Instead, these hypotheses flow from judicial and academic commentary in relation to the fair use doctrine. These additional hypotheses are:

H8 A finding of fair use is more likely if the defendant is a natural person;

H9 If the defendant is an underdog in terms of attorney representation, a finding of fair use is more likely; and

H10 If the defendant is an underdog in terms of law firm representation, a finding of fair use is more likely.

The third and final set of propositions relate to the effect of party characteristics tied to broader industry classifications. These are:
H11 Plaintiff Industry Group is a significant factor in fair use outcomes; and

H12 Defendant Industry Group is a significant factor in fair use outcomes.

Table 1 (below) reports the results of five separate multivariate logit regressions analyzing the relationship between a finding in favor of fair use (the dependent variable) and the various factors discussed in Part III (the independent variables).\footnote{Logit (or logistic regression) is a regression model designed for estimation of binary outcomes. I report logit results, but I have also verified the results using probit (another regression model designed for estimation of binary outcomes) and ordinary least squares (which is more suitable for a linear regression model); and the results are substantively the same in all relevant respects. See infra Statistical Appendix.}

Model 1 shows the effect of the statutory factors on fair use. The remaining models reported in Table 1 are variations of the first model. Model 2 adds variables relating to underdog status to the analysis of the core statutory factors. Model 3 combines the statutory factors with the plaintiff and defendant industry variables. Model 4 combines the statutory factors with the underdog natural-person variables and the plaintiff and defendant industry variables. Model 5 contains all three groups of variables and should be considered as the main finding of this study.\footnote{Model 4 addresses the missing data problem created by the incompleteness of the attorney and law firm experience data. See supra note 114. Omitting these variables allows me to run the regression over almost all of the data, whereas Model 5 is limited to 222 cases out of 283.}

Each of the regression models also contains a variable \textit{(Post 1994)} indicating whether the decision was before or after the Supreme Court's 1994 ruling in \textit{Campbell v. Acuff-Rose Music, Inc.}\footnote{510 U.S. 569 (1994).} This time-trend variable is designed to account for the possibility that \textit{Campbell} represented a fundamental realignment of fair use doctrine.

[Tabular material on following page.]
Table 1: The Effect of Various Objective Factors on a Finding in Favor of Fair Use (Multivariate Logit Regression)

<table>
<thead>
<tr>
<th>Doctrinal Basis</th>
<th>Variable</th>
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<tr>
<td>Industry</td>
<td>Plaintiff Industry</td>
<td>.031**</td>
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<tr>
<td></td>
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<tr>
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<td>Defendant Industry</td>
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<td></td>
<td>(.01)</td>
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<tr>
<td>Constant</td>
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<td>-.585</td>
</tr>
<tr>
<td>Pseudo R²</td>
<td></td>
<td>.073</td>
</tr>
</tbody>
</table>

N(1) = 277, N(2) = 222, N(3) = 271, N(4) = 270, N(5) = 222. ** Significant at the .01 level, * Significant at the .05 level, # Significant at the .10 level. Logit coefficients obtained using Robust Standard Errors. Standard errors in parentheses.
Tables of logit coefficients are not particularly easy to read. Although logistic regression is usually preferred for evaluating relationships between explanatory variables and dichotomous outcomes, it is helpful to duplicate the analysis using linear regression such as Ordinary Least Squares (OLS). OLS coefficients describe a constant ratio between the independent and dependent variables, which means that one can compare the substantive impact of two statistically significant variables simply by comparing their size. Complete OLS results are reported in Table 2 in the Appendix. The same information can be presented graphically to illustrate the relative substantive importance of the various factors. Figure 3 (below) contains the same data as Table 2 in the Appendix, but it is best understood as a visual complement to Table 1. The hollow bars in Figure 3 indicate that the variable was not statistically significant, gray shading indicates a significant negative coefficient (i.e., as the value of the variable increases, fair use becomes less likely), and black indicates a significant positive coefficient.

![Figure 3: OLS Coefficients Illustrating the Effect on a Finding in Favor of Fair Use](image)

Source: U.S. District Court fair use cases from 1978 to 2011. The coefficients illustrated above are reported in OLS regression 5, infra Statistical Appendix, Table 2. Black coefficients are positive, gray coefficients are negative, hollow bars represent coefficients that are not statistically significant.

The interpretation and implications of these results are explored in detail in the remainder of this Part.
B. The Core Statutory Fair Use Factors

1. Transformative Use

The Creative Shift variable was statistically significant in each of the five model specifications.\(^{125}\) The positive and significant coefficient associated with Creative Shift shows that, as predicted in H1, this proxy measure for transformative use makes a finding of fair use more likely. Recall that Direct Commercial Use might also be thought of as an indicator of transformative use.\(^{126}\) The significant negative coefficient for Direct Commercial Use confirms H3, that direct commercial use makes a finding of fair use less likely.\(^{127}\)

These results are not merely statistically significant in a technical sense; they are also clearly substantive. One way to see this is to compare the size of the OLS coefficients in Figure 3. Another way is to calculate the average predicted probability of a finding in favor of fair use under particular scenarios. For example, based on the regression in Model 5, the predicted probability of a finding in favor of fair use is \(.62\) if there is a Creative Shift, but only \(.33\) otherwise.\(^{128}\) This means that, holding everything else constant, the chances of a fair use win are almost double, increasing from \(33\%\) to \(62\%\), when this kind of transformative use is present. In other words, not knowing anything else about the defendant's use, a plaintiff can expect to win a clear majority of cases where there is no indication of transformative use, but otherwise expect to lose all but \(38\%\) of the time.

The substantive effect of Direct Commercial Use is similarly impressive. The predicted probability of a finding in favor of fair use is \(.29\) if the defendant is making a direct commercial use, and \(.47\) otherwise. In addition, the combination of these two effects is also substantively important. For example, the predicted probability of a successful assertion of fair use if there is Creative Shift and the defendant is not engaged in a direct commercial use is \(.72\)—i.e., more than seven cases in ten.

Does this prove that transformative use is the alpha and omega of fair use? Not quite. Although certain core aspects of transformative use are captured in

\(^{125}\) Although the significance of some variables is noted at the .10 level, this study relies primarily on results that meet the usual .05 standard. If a variable is significant at the .05 level, either the null hypothesis that the variable is not significant is wrong, or the patterns observed in the data are the product of the sort of random chance that one would expect to see in only 5% of similar regressions. Michael O. Finkelstein, Basic Concepts of Probability and Statistics in the Law 54 (2009). Importantly, failing to reject the null hypothesis at a given level of significance does not automatically mean that the null is correct. See Robert M. Liebert & Lynn Langenbach Liebert, Science and Behavior: An Introduction to Methods of Psychological Research 92 (4th ed. 1995).

\(^{126}\) See supra note 61 and accompanying text.

\(^{127}\) Direct Commercial Use is significant in four out of the five versions of the regression models.

\(^{128}\) Predicted probabilities range between 0 and 1 and are rounded to two decimal places.
the Creative Shift and Direct Commercial Use variables, these variables do not account for every aspect of transformative use. The most obvious indication of the shortcomings of the Creativity Shift measure is that it would not indicate that the defendant in Campbell v. Acuff-Rose Music, Inc.\(^{129}\)—the first judicial invocation of the term transformative use—was engaged in a transformative use. Nonetheless, the evidence emphatically confirms the significance of at least these core components of transformativeness in fair use litigation.

2. Amount and Substantiality

The variable Partial Copy was not significant in every regression model; however, it was significant in Model 5, which combines all of the variables of interest together.\(^{130}\) The significance of Partial Copy in the final model specification means that, controlling for certain attributes of legal personality and legal representation, Partial Copy is a significant predictor of fair use.\(^{131}\) The average predicted probability of fair use for cases involving partial copying is .44, whereas it is only .34 in those involving total copying. Thus, although its significance depends on the model specification, it seems reasonable to conclude that, consistent with H6, a finding of fair use is more likely where the defendant uses only part of the plaintiff’s work.

3. The Remaining Statutory Factors

The other statutory fair use factors were not significant. Commercial Use, Creative Work, Unpublished Work, and Industry Separation are insignificant across all five regression models. It must be stressed here that failure to find an effect is not the same thing as finding no effect.\(^{132}\) It is possible that a different research design or simply more data could lead to a different result.\(^{133}\) Nonetheless, for the moment what can be said is that there is no evidence that commercial use, the creative or unpublished nature of the copyrighted work, or market effect (measured in terms of industry separation) play any objectively ascertainable role in determining the outcome of fair use cases.

\(^{129}\) 510 U.S. 569 (1994).

\(^{130}\) The difference between Models 4 and 5 is the inclusion in the latter of the variables relating to attorney and law firm expertise—it is not clear why Partial Copy would be insignificant when these variables are absent, but significant when they are present. The most likely explanation is that the missing attorney experience data is correlated with a particular time period.

\(^{131}\) Interestingly, there are no significant correlations between these factors and the partial copy variable.

\(^{132}\) See Liebert, supra note 125, at 92.

\(^{133}\) Although it should be noted that the results were the same when this analysis was initially performed with data ranging between 1978 and 2006.
C. Party Status Variables

The party status and empowerment variables in Models 2, 4, and 5 yield some interesting results. The coefficient for Plaintiff Natural Person is positive and significant in each of the relevant specifications. Put simply, a finding of fair use in favor of the defendant is more likely if the plaintiff is a natural person and less likely if the plaintiff is a corporation. How important is this effect? Returning to Figure 3 (above) indicates that this factor, which has no direct relevance to the statutory fair use guidance, may be the most important predictor of litigation. The poor showing of natural-person plaintiffs is consistent with the well-developed literature on the success of “haves” over the “have-nots” in litigation discussed in Part III. However, it is in direct opposition to the notion that fair use favors the underdog and it undermines the characterization of fair use as a redistributive tool favoring the politically and economically disadvantaged.

The Defendant Natural Person coefficient is not significant in either direction. Conceivably, given the manifest disadvantages of the underdog in litigation, this null result may be a product of the collision of a fair use underdog effect and a more general litigation overdog effect. There are, however, many other possible explanations for the failure to find an effect, including selection effects, the relatively small size of the study population, and the potential for omitted variable bias.

Defendant Attorney Underdog produces a negative and significant coefficient in Models 2 and 5. This suggests that defendants who come to court with less experienced attorneys than their opponents are less likely to benefit from a finding of fair use. Again, this is consistent with the expectation that access to better lawyers should lead to better results, but it is inconsistent with the hypothesis that fair use favors the underdog. It should be noted that this finding is not particularly strong, however, given that it only holds at the .10 level of significance in the full specification in Model 5.

In summary, the results in relation to Plaintiff Natural Person and Defendant Attorney Underdog are contrary to the underdog theory of fair use. If fair use indeed favored the underdog, one would expect to see natural-person plaintiffs subjected to fair use less often and defendant underdogs prevailing on the issue of fair use more often. However, the regression analysis reported here suggests exactly the opposite; it confirms, if anything, the existence of an overdog effect in relation to fair use litigation.

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134 See supra notes 103-11 and accompanying text.
135 See supra Part III.B (discussing the origin of this view).
136 The fact that no similar effect is discernible for Defendant Law Firm Underdog also suggests some caution before accepting this result as proof of the advantages of retaining higher-status legal representation.
D. Industry Effects

As Table 1 indicates, the Plaintiff Industry variable is significant in Model 3 but not in Models 4 and 5, where industry variables are combined with party status variables. Defendant Industry is not significant in either model. Further analysis shows that there is a significant negative interaction between Plaintiff Industry and Defendant Natural Person, Plaintiff Natural Person and Defendant Law Firm Underdog. One interpretation of these results is that the appearance of an industry effect in Model 3 is an artifact of other party characteristics captured in Models 4 and 5. The industry effect disappears once party status and empowerment characteristics are taken into account. Under this interpretation, there is no evidence to support the industry effects hypotheses—H11 and H12. This suggests that patent law scholars may wish to revisit evidence of systemic industry variation in that field and consider whether other factors relating to party status and empowerment are not more relevant than industry.

E. Predicting Fair Use Outcomes

Is fair use predictable? The evidence presented here that transformative use and partial copying are both strong indicators of fair use makes it difficult to sustain the common charge of incoherence and unpredictability. As discussed, at least two aspects of the doctrine are coherent in the sense that, to the extent we can measure them, transformative use and partial copying are significant factors in favor of fair use.

The problem with fair use might be more about the way the statute is written than the essence of the doctrine itself. Section 107 of the Copyright Act lists several factors that are descriptively relevant, but do little to predict case outcomes. The lack of significance of commercial use and the nature of the work, combined with the subjectivity of market effect, may make fair use appear to be more unpredictable than it really is. The fact that the Copyright Act requires judges to consider these factors even though they have little or no forecasting potential inflates their importance. If we simply put these factors to one side and focus on the significant variables, the fair use doctrine begins to look more comprehensible.

The extent to which fair use is actually coherent can be illustrated by returning to the predicted probabilities derived from the final regression model in Table 1. The overall predicted probability of a finding in favor of fair use is

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137 The Plaintiff Industry * Defendant Natural Person interaction term is significant at the .10 level. The Plaintiff Industry * Plaintiff Natural Person and Plaintiff Industry * Defendant Law Firm Underdog interaction terms are significant at the .05 level.

138 For examples, see supra note 1.

This number increases progressively as additional favorable facts are added. The existence of a Creative Shift increases the predicted probability of fair use to .62. Adding the fact of partial copying expands the predicted probability further to .68. Finally, adding the observation that the plaintiff is a natural person increases the predicted probability of a finding in favor of fair use to .87. These cumulative predicted probabilities are illustrated in Figure 4 (below).

Figure 4: Cumulative Predicted Probability of a Fair Use Win

Source: OLS regression 5, infra Statistical Appendix, Table 2. N = 222. The factors are cumulative, such that the "Partial Copy" includes Transformative, and "Natural Person \( P \)" includes Transformative and Partial Copy.

As the figure illustrates, some case facts do actually have a significant influence on the range of likely outcomes. The dashed gray line in Figure 4 represents a predicted probability of 50%. The presence of a Creativity Shift indicating transformative use makes a fair use win more likely than not, but the line extending one standard deviation below the mean still crosses the 50% threshold. Combining two factors quite favorable to the defendant, transformative use and partial copying, lifts the range of predicted probabilities almost entirely above the 50% threshold. And of course, adding the additional

\[^{140}\text{This differs slightly from the simple average fair use win rate (.39) because not all observations are included in the regression from which the predicted probabilities are derived.}\]
favorable variable of a weak plaintiff makes a finding in favor of fair use all but inevitable.

These predictions are not iron-clad guarantees, they are simply estimations of the approximate size of the effects. There will no doubt continue to be many aspects of fair use litigation that cannot be captured in averages, generalizations, or statistical approximations. There remains, in other words, a role for legal doctrine, subjectivity, and advocacy. Although this study does not indicate that the outcomes of fair use cases are obvious or mechanical, nevertheless it does suggest that fair use is much more than merely the right to hire a lawyer and take one's chances. Properly understood, fair use jurisprudence is fairly useful.

F. Alternative Explanations

Empirical analysis is a matter of both art and science. The data and analysis presented here are open to multiple interpretations. In this section, I will briefly explore some of those alternative explanations for the results presented thus far.

1. The Effect of Changes in Precedent over Time and Between Circuits

The first alternative explanation is that the patterns that emerge from the case law are in fact driven by other factors, such as changing precedent over time or even differences in precedent between the federal circuits. Figure 5 (below) illustrates why these factors might be important.
The figure depicts a three-year moving average for the fair use win rate for all federal district courts (dashed gray line), the Second Circuit (tightly dashed black line) and all remaining circuits (solid black line). There are several points of interest here. First, fair use win rates spiked up at the beginning of the dotcom era in the late 1990s and remained high until 2010. The regression models presented here attempt to control for a potential time effect by including a dummy variable for before and after the Supreme Court’s decision in *Campbell v. Acuff-Rose Music, Inc.* The results do not change in any substantive way if that time dummy is confined to the period 2000–2011.

Another point of interest in relation to Figure 5 is that fair use win rates are mostly higher in the influential Second Circuit than in the rest of the nation. However, notice that other than in the periods from 1978 to 1984 and 1989 to 1991, the national trend and the Second Circuit trend have moved very closely together. The main results are unchanged after adding a Second Circuit dummy variable, except that *Partial Copy* and *Direct Commercial Use* are significant at the .06 level instead of .05.

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2. Selection Effects

The second alternative explanation for the results explored in this Article relates to selection effects. Any study that focuses on litigated cases naturally raises the issue of potential selection bias. As Priest and Klein famously observed, it is very difficult to make inferences about the broader universe of all disputes by observing the very low proportion of cases that actually go to trial. The time-consuming and costly process of litigation does not generate a random sample of all potential disputes; rather, litigation acts as a filter, selecting only those cases where uncertainty about the law, asymmetric stakes, divergent expectations, or other quirks of human behavior have prevented the parties from settling their dispute. All of the results reported in this Article must be understood in this context.

The potential for selection bias notwithstanding, the fact remains that litigated cases are important and they are constantly subject to ad hoc empirical assessments. Disputes that culminate in written decisions are the primary source of information for lawyers and judges attempting to discover the content of the law. Written opinions are particularly important because they provide analogies and reasoning that can be extended to future cases. Lawyers and academics constantly call upon their assessment of "what really happens" in fair use cases to inform their understanding of the law. It is easy to overlook the fact that these explanations are prone to the very same selection bias that qualifies the findings presented in this study.

The unrepresentative nature of written opinions does not imply that scholars should abandon the field of empirical legal studies, but it does call for some caution in interpreting results. Empirical tools are extremely useful for patterns within the observed data. More importantly, they also allow for assessments of whether those patterns are statistically significant, according to conventional standards, in the sense that they reflect a pattern beyond mere coincidence. Readers should decide for themselves whether to draw inferences about future cases or disputes that do not result in written opinions.


143 See generally Robert H. Gertner, Asymmetric Information, Uncertainty, and Selection Bias in Litigation, 1993 U. CHI. L. SCH. ROUNDTABLE 75 (summarizing the vast literature following on from the Priest-Klein model). A related complicating factor in any longitudinal study such as ours is that the selection effect may not even be constant as the results of prior cases necessarily inform the expectations of future litigants.

144 See supra note 1.

145 See supra note 125.
V. CONCLUSION

This Article has undertaken a comprehensive empirical review of the fair use doctrine in copyright law. This study goes beyond merely synthesizing the content of fair use decisions: it reduces the fundamental aspects of the fair use doctrine to a set of testable implications. In short, it enables an assessment of the degree to which various claims, theories, and intuitions about fair use are supported by the data.

This Article makes a significant contribution to the copyright literature on the mechanics of fair use. To begin with, the evidence from litigated cases analyzed in this Article confirms the centrality of transformative use. A transformative work is one that imbues the original “with a further purpose or different character, altering the first with new expression, meaning, or message.” Measured in terms of the variable Creativity Shift, it appears that transformative use by the defendant is a robust predictor of a finding of fair use. Likewise, the contrast between the significance of direct commercial use and the insignificance of commercial use overall reinforces the dominance of transformative use over other factors. The empirical evidence presented here contradicts the assessment that transformative use is merely an ex post synonym for fair use.

Second, the results of this study also confirm the significance of the statutory factor that addresses “the amount and substantiality” of the defendant’s unauthorized use of the plaintiff’s work. Although the effect is not as large as was transformative use, there is clear evidence confirming that partial copying weighs in favor of the defendant’s assertion of fair use. At a practical level, this reinforces the wisdom of minimizing the extent of unauthorized use when relying on the fair use defense. However, it is also apparent from the data that there are many strong cases of fair use involving copying the entirety of the plaintiff’s work. Technologies that rely on digital processing of entire copyrighted works, such as Internet search engines and plagiarism detection software, nonetheless present a very strong case for fair use.

See Campbell, 510 U.S. at 579 (holding that the creation of transformative works lies “at the heart of the fair use doctrine’s guarantee of breathing space within the confines of copyright”).

Creative shift is an asymmetry between the works of the plaintiff and the defendant such that one is more creative and the other is more informational.

See, e.g., Nimmer & Nimmer, supra note 50, § 13.05[A][1][b].


See, e.g., A.V. v. iParadigms, LLC, 562 F.3d 630, 642 (4th Cir. 2009) (finding the automated processing of the plaintiff students’ work in defendant’s plagiarism detection software was fair use); Perfect 10, Inc. v. Amazon.com, Inc., 508 F.3d 1146, 1168 (9th Cir. 2007) (finding that the automated processing and display of thumbnails of copyrighted photos as part of a visual search engine was fair use); Kelly v. Arriba Soft Corp., 336 F.3d 811, 816 (9th Cir. 2003) (same).
The third major contribution of this Article is demonstrating that there is no evidence that commercial use (in contrast to direct commercial use) reduces the defendant’s chance of maintaining a fair use defense. As noted in Part III, the presumption against commercial use expressed in dicta in the Supreme Court’s Sony decision is difficult to reconcile with private commercial incentives copyright is designed to produce. Ten years later, this presumption was implicitly rejected by the Court in Campbell. The evidence contained in this study indicates no anticommercial bias in fair use. There are sound doctrinal reasons for unequivocally discarding the Sony presumption and the evidence suggests that a majority of district courts have in fact already done so. Commercial/noncommercial simply does not appear to capture any meaningful distinction in litigated fair use cases.

The fourth contribution is closely tied to the third. In addition to rejecting the proposition that commercial use makes fair use less likely, the related view, which characterizes the doctrine as a kind of subsidy or a redistributive tool favoring the politically and economically disadvantaged, can also be set aside. Regression analysis of the effect of party status variables on the probability of a finding of fair use either failed to find the predicted underdog effect or found exactly the opposite.

Together, these four findings tell us a great deal about the broader nature of the doctrine. Fair use is not a timid exception to the rights of copyright owners or a compulsory form of copyright charity; it is an integral part of the copyright system. The right to make fair use of a copyrighted work is equally applicable to Fortune 500 companies as it is to struggling artists. Fair use creates breathing space for cultural engagement in the form of reinterpretation and remixing of copyrighted content. Just as importantly, fair use also makes it possible for large commercial entities to build tools such as search engines that make the Internet work and to create platforms such as YouTube and Facebook for sharing individual self-expression.

The final, and perhaps most important contribution of this Article is that it offers considerable evidence against the oft-repeated assertion that fair use adjudication is blighted by unpredictability and doctrinal incoherence. The predictability of fair use is a question of central importance for copyright law in the United States and around the world. Many in the United States criticize what they perceive to be the mercurial nature of fair use—what they arguably fail to see is the role that a flexible fair use doctrine has in smoothing out the rough edges of copyright.

In 2010, the Prime Minister of the United Kingdom commissioned a review to determine whether the current intellectual property framework of the United Kingdom might be inhibiting innovation and growth in the U.K. economy. The Prime Minister noted that:

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152 Campbell, 510 U.S. at 584.
153 See supra Part IV.F.1.
154 See Hargreaves, supra note 9, at 1.
The founders of Google have said they could never have started their company in Britain. The service they provide depends on taking a snapshot of all the content on the internet at any one time and they feel our copyright system is not as friendly to this sort of innovation as it is in the United States. Over there, they have what are called “fair use” provisions, which some people believe gives companies more breathing space to create new products and services.155

The Hargreaves report, commissioned by the British government, ultimately recommended against grafting a U.S.-style fair use exemption onto English copyright law because, in part, of the perceived uncertainty of fair use.156 Instead the Hargreaves report recommends a number of specific exemptions that follow the results of American fair use cases.157 This approach will address some of the most glaring problems with English copyright law, but it will also probably ensure that the United Kingdom continues to lag behind the United States in a number of technological fields.158

Although the Hargreaves Commission appears to have accurately understood the potential benefits of fair use, it, like many American commentators, has misunderstood and exaggerated the costs. Standards are not necessarily more unpredictable than rules,159 nor is flexibility the same thing as unpredictability. The evidence presented in this Article suggests that fair use is not nearly so incoherent or unpredictable as is conventionally assumed.

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155 Id. at 44 (quoting David Cameron, November 2010, announcing the Review of IP and Growth).

156 Id. at 44. Several countries around the world are considering adopting a fair use provision in order to help copyright keep pace with technological change. Israel adopted a fair use provision in 2008. Id. at 45. Singapore uses a multi-factor fair-dealing test that is similar to fair use. Id. at 45. The Irish Government is explicitly considering moving toward a fair-use-style doctrine. In the United Kingdom, the Hargreaves Commission on Intellectual Property and Growth recently considered but rejected adopting a fair use standard. Id. at 43–44.

157 Id. at 44–50.

158 As the Commission recognizes, under the existing European approach to copyright exceptions, “new kinds of copying which have become possible due to advancing digital technology are automatically unlawful.” Id. at 43.

A. Case Selection

The data in this study consists of U.S. District Court cases resulting in a written opinion published in the Lexis database where the issue of fair use was raised and adjudicated. The data includes rulings on preliminary injunctions, motions, and cross-motions for summary judgment, bench trials, motions to dismiss, and motions for judgment notwithstanding the verdict. The data includes all such cases decided between January 1, 1978 (the day the Copyright Act of 1976 came into effect) and May 31, 2011.

B. Statistical Software

The statistical analysis for this study was performed in Stata/SE 11.1.

[Tabular material on following page.]

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A search for the term “fair use” in the date range (01/01/1978) to (05/31/2011) in the Lexis US District Court Cases database yields over 1000 initial results; however, the majority of these are trademark cases and relate to a different fair use doctrine entirely. Additional search terms such as “17 U.S.C. § 107” and “purpose and character” were used to reduce the population to true fair use cases. Cases matching these terms were reviewed individually to exclude cases where fair use is referred to in passing, but not adjudicated.
C. Independent Variables

Table 2: Summary Statistics for Independent Variables

<table>
<thead>
<tr>
<th>Variable</th>
<th>Mean</th>
<th>Standard Deviation</th>
<th>Range [Min Max]</th>
<th>Mean Finding in Favor of Fair Use if variable =1</th>
<th>Mean Finding in Favor of Fair Use if variable =0</th>
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</thead>
<tbody>
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<td>.407</td>
<td>[0 1]</td>
<td>.593</td>
<td>.328</td>
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<td>Commercial Use</td>
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<td>[0 1]</td>
<td>.372</td>
<td>.487</td>
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<td>Direct Commercial Use</td>
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<td>.499</td>
<td>[0 1]</td>
<td>.308</td>
<td>.470</td>
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<td>Creative Work (Plaintiff)</td>
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<td>[0 1]</td>
<td>.437</td>
<td>.355</td>
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<td>Unpublished Work (Plaintiff)</td>
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<td>.449</td>
<td>[0 1]</td>
<td>.462</td>
<td>.375</td>
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<td>.497</td>
<td>[0 1]</td>
<td>.434</td>
<td>.341</td>
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<td>[0 1]</td>
<td>.452</td>
<td>.354</td>
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<td>[0 1]</td>
<td>.426</td>
<td>.368</td>
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<td>.374</td>
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<td>.243</td>
<td>.411</td>
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<td>[0 1]</td>
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<td>.361</td>
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N=222.

D. Alternative Analysis Using Linear Regression

Like Table 1 in the main text, Table 3 (below) reports the results of five separate multivariate regressions analyzing the relationship between a finding in favor of fair use and the various factors discussed in Part III. The difference between Table 1 in the main text and Table 3 below is that the former reports logistic regression specifications whereas the current table reports Ordinary Least Squares (OLS) regressions. The dependent variable of interest in this study is dichotomous—either the defendant’s claim of fair use was successful or it was not. Whereas a linear regression model attempts to predict the values of the outcome variable along a straight line, the usual way to model dichotomous dependent outcomes is to use logistic regression (or a logit model) to predict the probability that the outcome = 1. However, as noted in the main text, rendering the same analysis in OLS is a useful illustration of the relative weights of the coefficients of interest.
Table 3: The Effect of Various Objective Factors on a Finding in Favor of Fair Use (OLS Regression)

<table>
<thead>
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<th>Doctrinal Basis</th>
<th>Variable</th>
<th>Regression Model</th>
<th>Finding of Fair Use</th>
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<td>(1)</td>
<td>(2)</td>
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<td>Creative Shift</td>
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<td>.268**</td>
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<td>(.09)</td>
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<td></td>
<td></td>
<td>(.09)</td>
<td>(.11)</td>
</tr>
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<td>Direct Commercial Use</td>
<td>-.137*</td>
<td>-.145*</td>
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<td>(.07)</td>
<td>(.07)</td>
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N(1) = 277, N(2) = 222, N(3) = 271, N(4) = 270, N(5) = 222. ** Significant at the .01 level, * Significant at the .05 level, # Significant at the .10 level. Logit coefficients obtained using Robust Standard Errors. Standard errors in parentheses.
E. Circuit Differences

Figure 6 illustrates the proportion of fair use cases for each of the U.S. Courts of Appeals. As shown, the Second, Ninth, and Eleventh Circuits account for a majority of the cases in the dataset.

Figure 6: U.S. Federal District Court Fair Use Cases by Circuit

The upper illustration of Figure 7 depicts a three-year moving average for the fair use win rate for all federal district courts (dashed gray line), the Ninth Circuit (tightly dashed black line) and all remaining circuits (solid black line). The lower illustration is the same except that it features the Eleventh Circuit. Note that variation in the Ninth Circuit is more extreme and that the Eleventh Circuit closely follows the national trend.
Figure 7: Average Fair Use Win Rate by Circuit

Ninth Circuit

Eleventh Circuit