Valuation of Government Policies and Projects

Deborah Lucas

Sloan School of Management, Massachusetts Institute of Technology, Cambridge, Massachusetts 02142; email: dluca@mit.edu

Keywords
asset pricing, cost of capital, government guarantees, social discount rate

Abstract
Governments play a central role in the allocation of capital and risk in the economy. Evaluating the cost to taxpayers of government investments requires an assumption about the government's cost of capital. Governments often take their borrowing rate to be their cost of capital, which implicitly treats the market risk associated with their activities as having no cost to taxpayers. This article reviews the theoretical and practical rationale for treating market risk as a cost to governments, presents an interpretive review of the growing literature that applies the concepts and tools of modern finance to evaluating the costs of government policies and projects, and suggests directions for future research. Examples considered include deposit insurance, Fannie Mae and Freddie Mac, the Federal Reserve’s emergency lending facilities, student loans, real infrastructure investments, and public pension plans.
1. INTRODUCTION

Governments play a central role in the allocation of capital and risk in the economy. (For an overview of those activities see Moss 2004 and Elliott 2011.) As well as making real investments in infrastructure, property, plants, and equipment, governments engage in a wide range of financial activities: They guarantee or make direct loans for housing, education, agriculture, small businesses, energy, and trade; explicitly insure bank deposits, defined-benefit pension plans, crops, and real property and implicitly insure too-big-to-fail financial institutions; conduct monetary policy through capital market transactions; provide pension benefits to federal civilian and military employees; promise social security and other contingent social insurance payments; and implicitly or explicitly guarantee the obligations of government-sponsored enterprises such as the Federal Home Loan Banks and the Farm Credit System.

How should governments assess the cost of such activities, and how does that compare to the valuation methods they typically use in practice? Those questions are important because accurate valuations are necessary for informed investment decisions, effective management, and meaningful public oversight. This article presents an interpretive review of the growing literature that aims to provide answers by applying the concepts and tools of modern finance to valuing government policies and projects. It also highlights some important examples of where the financial economics approach leads to significantly different answers than the methods currently used by governments to assess the cost of their activities.

The validity of applying the methods of financial economics to valuing government policies and projects rests on the principle that the government’s cost of capital, as with that of the private sector, depends primarily on the priced risks associated with the activity being evaluated. From that perspective, taxpayers and other government stakeholders are equity holders in government investments and through the tax and transfer system bear the associated market risk. The government diversifies away most of the idiosyncratic risk associated with its activities. Although most economists accept that view, market risk is generally not recognized as representing a cost to the government—either by policymakers or by the government accounting rules that operationalize notions of cost. Section 2 reviews the literature on the theoretical and practical relevance of market prices for government valuation.

The direct cost of government activities, which is the focus here, is only one of several considerations that generally go into a cost-benefit analysis of a project or policy. Determining whether it is socially optimal for the government to undertake an activity also involves an assessment of its value to beneficiaries, any associated positive and negative externalities, its effects on the distribution of income and wealth, and other policy goals. However, the importance of additional information for project evaluation does not diminish the usefulness of obtaining the most accurate possible estimates of the direct costs of government endeavors.

Adapting traditional financial models to government applications gives rise to interesting conceptual and technical challenges for researchers:

- Governments face different constraints than private firms, and they often engage in activities that do not have a direct private analog. Importantly, because of their ability to levy taxes, governments are not bound by a break-even constraint. Hence, they can offer subsidies, which tend to drive out private provision of similar financial services and products, making it harder to identify comparable market prices to use for valuation.
The relevant horizon for government policies can be considerably longer than for private institutions. For instance, policymakers are interested in the present values of social insurance obligations and the costs of climate change over periods that span a century or longer.

Government policies can affect market prices, such as when it provides implicit catastrophic guarantees to financial institutions that lower their cost of debt financing. Such effects complicate the use of market prices to draw inferences about costs.

Those considerations can make the seemingly straightforward problem of choosing appropriate discount rates more difficult in government contexts. Section 3 reviews the literature on inferring risk-adjusted discount rates for government applications, including valuing government direct loans and loan guarantees; evaluating the size of underfunding of state and local pension plans; calculating the cost of capital for real investment projects; and using the insights of the recent literature on long-run risk to assess the underfunding of the social security system.

Many of the most technically interesting applications of financial economics to government valuation problems have employed a contingent claims or derivative pricing approach, whereby the value of claims can be inferred by finding a set of publicly traded securities that replicate (precisely or approximately) their cash flows. Merton (1977, 1978) was the first to recognize that many government obligations are contingent claims that can be valued most accurately using such methods, and he applied that insight to derive equations to value deposit insurance. Since that time, researchers have developed derivative pricing models to value a wide variety of government guarantees. Section 4 surveys many of those applications, which include guarantees of deposit insurance; pension and social security benefits; Fannie Mae and Freddie Mac; and agricultural loans, mortgages, and corporate obligations.

The remainder of the article is organized as follows: Section 2 reviews the theoretical and practical rationales for using market prices to infer the government’s cost of capital. Section 3 surveys the research on risk-adjusting discount rates for a variety of government applications and contrasts those findings with government practice. Section 4 discusses applications of derivative pricing techniques to valuing a variety of government assets and liabilities. Section 5 concludes with a summary of the main points, a discussion of unresolved issues, and suggestions for future research.

2. THE GOVERNMENT’S COST OF CAPITAL

Is the government’s cost of capital (and hence the rates it should use to discount future cash flows) similar to that of private businesses and investors? That question, which was the subject of a lively debate between leading economists in the late 1960s and early 1970s, was more recently revisited in Bazelon & Smetters (1999) and Lucas & Phaup (2010). The discussion here draws on Lucas & Phaup (2010), which reviews the theoretical and practical rationales for using market or fair values to evaluate the budgetary cost of government activities.

The private cost of capital has two main components: the pure time value of money and a risk premium. In principle, either component could have a higher or lower cost to the government than to the private sector. However, the debate among economists has generally been about whether the government should assign a lower cost to risk than the private
sector (e.g., because it can achieve greater diversification) and whether the government has a lower time value (e.g., because it assigns more value to the welfare of future generations).

2.1. Implications of the Modigliani-Miller Theorem for the Government

Modigliani & Miller (1958) show that in the absence of market imperfections, the cost of risk associated with a corporate investment depends only on its own risk characteristics, not on the combination of debt and equity used to finance it. By contrast, a common view among some policy analysts and government officials is that the market risk associated with investments is not costly to the government because the government can borrow at Treasury rates.

Applying the Modigliani-Miller balance sheet perspective to government investments is perhaps the clearest way to see why Treasury rates are not the government’s cost of capital: Risky investments can never be entirely debt-financed. When the government funds risky investments by selling safe Treasury securities, risk is shifted onto current and future taxpayers and other government stakeholders, who effectively become equity holders in a leveraged risky investment.

For example, the government could fund an investment in common stock with the sale of Treasury securities of equal market value. On average, the portfolio would appear to earn a profit each year equal to the equity risk premium. However, from a taxpayer perspective, the gain is offset by the cost of the associated market risk. If the stock market performed poorly, the government would be able to pay back the debt and use the surplus to lower taxes or increase other spending. If the stock market performed poorly, the debt still would have to be repaid, either by raising taxes or cutting other spending. A taxpayer that made the same investment on his own would view the positive expected return as compensation for risk, not as a profit.

2.2. The Early Debate

Holding a portfolio of publicly traded stocks funded by issuing Treasury securities clearly is not a money machine for the government. However, a more subtle issue is whether most government investment activities are “spanned” by the investments made by the private sector, or whether government investments primarily serve to make markets more complete. Academic interest in that question peaked in the late 1960s and early 1970s following important advances in general equilibrium theory, particularly the contributions of Arrow & Debreu (1954) and Debreu (1959). Those developments allowed for more general welfare analyses of policy. They also highlighted the benefits of risk-sharing, the aggregate limits on risk-sharing, and the role of market prices in aggregating the risk preferences of society.

Diamond (1967) analyzed the role of government investment in an economy with technology risk and a stock market. He concluded that if markets are sufficiently complete for stock prices to reflect the social cost of risk, then those prices are also relevant to the government in evaluating its investment policy. Hirshleifer (1964, 1966) reached

---

1The ability of the government to issue debt to fund deficits does not change that conclusion. Any debt issued to cover an investment shortfall eventually has to be repaid, with accumulated interest, out of future tax revenues. That is, taxpayers effectively incur investment losses as they occur; government borrowing serves to change the timing of when taxes are collected to cover the losses.
similar conclusions and argued forcefully for the use of market prices for valuing government investments.

In Jorgenson et al. (1964), Samuelson and Vickrey argue that because the government holds a large and diversified portfolio of projects, the marginal return from public investment, overall, is virtually risk-free and hence should be evaluated at the risk-free rate rather than the higher market rate demanded by less diversified individuals. In a paper that remains highly influential in the policy community, Arrow & Lind (1970) formalize that argument. Specifically, they posit an economy with complete contingent claims (i.e., complete insurance markets) and no aggregate uncertainty. They conclude that the social and private discount rate is equated at the risk-free rate. Arrow & Lind acknowledge that their conclusions depend on the assumption that government investment entails no aggregate risk and defend the assumption as plausible because correlated risk is likely to be insignificant for many government investments.

Sandmo (1972) clarifies the relation between those opposing points of view. He notes the difference rests on the assumption about whether the returns on public investment projects are correlated with the returns on private projects. Sandmo goes on to suggest that for the modern economies of Europe and the United States, Hirshleifer’s view is more plausible. He also observes that the contributions of Sharpe (1964), Lintner (1965), and Modigliani & Miller (1958)—a body of work that underpins modern financial economics—are highly relevant to the debate, but rarely cited in the context of public investment.

As discussed by Sandmo & Dreze (1971) and references therein, the question of whether there is a well-defined social (risk-free) discount rate and whether it can be inferred from market prices also hinges on whether markets are complete and if not the nature of the incompleteness. When markets are incomplete, using Treasury rates to represent the pure rate of time preference can lead to suboptimal government investment decisions, but it is difficult to quantify the bias. The early literature broadly concluded that in the presence of distorting taxes and various other types of market frictions, there is not a unique rate of time preference appropriate for evaluating all public investments.

### 2.3. Market Incompleteness: Evidence and Implications

Finding evidence of a large risk premium associated with idiosyncratic risk would support the Arrow-Lind story that the government has a significant advantage at risk-bearing because it can spread idiosyncratic risk through the tax system. Many empirical studies have tested whether idiosyncratic risk is priced, using the framework of the Sharpe and Lintner capital asset pricing model or multifactor models (e.g., Fama & French 1992). Those studies find little evidence in support of that view, although researchers continue to revisit the evidence. It has also been suggested that the equity premium puzzle—the difficulty of reconciling the observed return on stocks with simple parameterized aggregate pricing models—implies that markets are placing too high a price on risk. However, the robust predictions of asset pricing theory put very few quantitative restrictions on expected or realized returns, and it is difficult to interpret the observed equity premium as evidence for or against the efficiency of financial markets.

As discussed above, the main difference between the views of Arrow & Lind and early proponents of using market prices rests on whether the returns on public investments are correlated with those on private investments. It appears that most of the government’s financial activities in recent decades (making or guaranteeing loans, insuring deposits and
retirement benefits, and explicitly or implicitly providing insurance to financial institutions) have analogs in the private sector.

It is sometimes asserted (particularly in the context of pension obligations) that because the government can wait out market risk but individuals cannot, it is legitimate for the government to treat the risk premium as a gain. However, having a long investment horizon does not avoid the cost of market risk: Bodie (1995) shows that the price of insuring an equity portfolio against a return that is below the risk-free rate actually increases with investment horizon, even if one assumes that stock returns are mean-reverting in the long run.

Although concerns about incomplete markets may cast doubts about the use of market prices in some instances, no generally better alternative for evaluating project costs has been identified. The most common alternatives to market prices, governments' own borrowing rates, also are market prices and hence susceptible to similar criticisms. Furthermore, whether the social cost of capital is higher or lower than what is implied by market prices cannot be answered in general. For example, the market price of risk may understate its social cost when the full risk of an activity is not borne by the private sector. That can occur when the government assumes tail risks that are unlikely to materialize but that are highly correlated with market downturns. (Kelly, Lustig & Van Nieuwerburgh 2011 examine that idea empirically using data on options prices.) In practice, perhaps the most important reason to favor using market prices to evaluate government costs is to align the incentives facing policymakers with the interests of the public (see sidebar).

One should recognize that government investment activities may increase social welfare by helping to complete markets, even if markets are complete enough so that it makes

**INCENTIVES FOR GOVERNMENT DECISION-MAKING**

An important practical reason to include a market risk premium in calculations of governments' capital costs is to avoid the perverse incentives created for policymakers when it is omitted (see CBO 2003 and Lucas & Phaup 2008 for a more complete discussion of the consequences of the omission of market risk in federal budgetary accounting).

**Avoiding Budgetary Arbitrage**

Investments in risky claims look cheap for the government when market risk is neglected, which creates an incentive to overinvest in them. For example, the federal student loan program lends to borrowers on more favorable terms than what would be offered by the most efficient and competitive private financial institution. The federal budget reports an expected profit from those loans.

**Putting Credit and Noncredit Assistance on a Level Playing Field**

Governments can provide assistance to target groups via credit subsidies or in noncredit forms. Neglecting the cost of market risk lowers the perceived cost of credit assistance relative to that of economically equivalent grant or benefit payments, creating an incentive to over-rely on credit assistance relative to other alternatives.

**Making Financial Transactions at Market Prices Budget-Neutral**

When market risk is not accounted for, buying financial assets at competitive prices appears to make money for the government, whereas selling them appears to lose money, distorting the incentives faced by government portfolio managers.
sense to treat the government’s cost of capital as being equivalent to that of the private sector. For example, government credit support may alleviate informational and contractual frictions in credit markets (e.g., Stiglitz & Weiss 1981 and Williamson 1994); public financing of infrastructure projects may improve welfare when it is infeasible for the private sector to collect sufficient revenues from users; and through social insurance programs, the government may be able to increase welfare by improving risk-sharing between generations (e.g., Telmer, Storesletten & Yaron 1999).

3. RISK-ADJUSTING DISCOUNT RATES
This section highlights three important areas where taking a financial economics approach to deriving risk-adjusted discount rates yields additional insights and produces estimates that differ significantly from those used by policymakers: (a) federally backed credit programs, (b) real investments such as infrastructure projects, and (c) government retirement programs including state and local defined-benefit pension plans and social security.

3.1. Federally Backed Credit
Federally backed direct loans and loan guarantees outstanding for programs such as student loans, mortgage guarantees, farm credit, and small business loan guarantees stood at $2.5 trillion in 2010. By law, the subsidy costs recorded in the federal budget for such programs are calculated under the rules of the Federal Credit Reform Act of 1990 (FCRA). That law specifies that credit subsidy costs are to be calculated by projecting expected future cash flows to and from the government (e.g., interest payments, principal repayments, fees, and guarantee payments) and discounting them to the year a loan is disbursed, at Treasury rates of comparable maturities.

Hence, the rules for calculating federal credit subsidies take into account expected losses from defaults, but not the market risk premium that arises because default rates tend to be higher, and recovery rates lower, when the overall economy is weak. Because of the omission of a market risk premium, several major federal credit programs appear to make money for the government. In 2010, the federal budget showed savings of approximately $14 billion associated with new loan origination under those programs. The apparent savings disappear, and collectively the programs have a significant cost of approximately $32 billion when a charge for market risk is incorporated into subsidy calculations (Lucas 2011).

Choosing risk-adjusted discount rates to estimate the market or fair values of government credit programs and guarantees can be complicated because often there are a lack of comparable transactions from which to draw inferences: Government subsidies tend to drive out the private provision of comparable offering, or similar arrangements are not economically feasible for the private sector to offer at any price. In such instances, it is still

---

2 Consistent with that view, Kaplow (2006) develops a framework that formalizes the idea that efficiency and how much weight should be placed on different generations are issues that can be separated. In his analysis, increasing efficiency is to the benefit of all generations, and efficiency is properly assessed using market prices.

3 That total omits credit-related federal obligations that are not budgeted for under the Federal Credit Reform Act of 1990, including the $5.3 trillion of mortgages and mortgage-backed securities guaranteed or owned by Fannie Mae and Freddie Mac and the financial assets acquired through the Troubled Asset Relief Program. It also excludes obligations classified as insurance, such as the deposit guarantees from the Federal Deposit Insurance Corporation and the pension benefit guarantees from the Pension Benefit Guarantee Corporation, and implicit guarantees of government-sponsored enterprises, such as the Federal Home Loan Banks and the Farm Credit System.
possible to estimate an applicable risk premium by considering the expected returns on private sector offerings that share key characteristics and making adjustments for identifiable differences between government and private credit instruments.

Using risk-adjusted discount rates is often the most straightforward way to value direct loans made by the government (i.e., loans originated, financed, and serviced by the government). The same approach also can be applied to the valuation of many loan guarantee programs by recognizing that the value of a loan guarantee can be approximated by taking the difference between the value of a loan safe from default and the value of a loan with the same promised cash flows but with default risk. Loan guarantees also can be valued as put options using derivative pricing methods (and more complicated guarantees require the use of such methods); examples of guarantees that have been valued as derivatives are covered in Section 4 below.

An example of a sizable credit market which is largely governmental, but where comparable private products do exist and can be used to infer risk-adjusted discount rates, is for student loans. Lucas & Moore (2010) estimate the fair value of government-backed student loans using information on pricing and loan performance for both government and private student loans. Complications in inferring the associated market risk premium and program cost include adjusting for the treatment of administrative costs by the government; identifying the component of quoted interest rates that function as fees to cover administrative costs; adjusting for the fixed and floating rates components of flows; differences in the borrower populations, particularly differences in expected default and recovery rates; and differences in loan characteristics such as embedded options to prepay or defer payments. Adjusting for such factors, Lucas & Moore inferred a market risk premium of approximately 2.2% over Treasury yields, which reflects the significant risk in making long-maturity unsecured loans to households. The resulting model of the term structure of risk-adjusted interest rates, together with a stochastic model of federal student loan cash flows, is used to estimate the fair value of federal student loans that were originated in 2006. Subsidy rates on the loans (the present value of net losses to the government per dollar of loan principal) inclusive of a risk premium were approximately 20 percentage points higher than subsidy rates computed using Treasury rates for discounting.

A case where directly comparable private credit arrangements are not available is for the loans guaranteed under the Department of Energy’s (DOE’s) Title XVII program, which offers incentives for innovative energy technologies. Even if banks were willing to extend similar loans without a government guarantee, information about private contractual terms is usually confidential. A workaround for valuing government credit to commercial enterprises is to infer a credit rating based on characteristics of the enterprise and the project. Specifically, projected default and recovery rates (which the government already routinely estimates) can be mapped into a credit rating using historical data. The risk premium associated with the credit rating can then be used to infer risk-adjusted discount rates for loan cash flows (e.g., Hull, Prediscu & White 2005). The Congressional Budget Office (CBO) (2011b) took that approach to estimating the fair-value subsidy rates for government loan guarantees offered by the DOE under Title XVII for the construction of nuclear power plants. The inclusion of a market risk premium significantly increases the

---

CBO is required under FCRA to use Treasury rates for its budgetary estimates of the cost of credit programs. However, it has undertaken a series of studies that provide fair-value estimates of subsidies for government credit programs to give policymakers more comprehensive information about program cost.
estimated subsidy on those long-lived, fixed-rate loans. For example, CBO estimates that for a nuclear project with a B rating from Standard and Poor’s and an assumed 55% recovery rate, the subsidy rate is 11% when Treasury rates are used for discounting, and 27% when the discount rates are risk-adjusted.

Several researchers have sought to measure the value of subsidies conferred to Fannie Mae and Freddie Mac from their government backing. Prior to being taken into federal conservatorship in 2008 that backing was implicit: Although investors assumed they would be protected from losses by the government, the securities issued by Fannie Mae and Freddie Mac did not carry a legal guarantee. Nevertheless, the perception of an implicit guarantee allowed Fannie Mae and Freddie Mac to borrow at lower interest rates than similarly risky financial institutions. Ambrose & Warga (2002) estimated a borrowing advantage of between 43 and 47 basis points over A-rated bonds issued by banks. Using a similar spread assumption, CBO (2001) estimated that Fannie Mae and Freddie Mac received federal subsidies of $45.4 billion between 1995 and 2000, based on capitalizing the borrowing advantage over the expected life of debt issued over that period. Implicit federal backing also made their guarantees of mortgage-backed securities (MBSs) more valuable; CBO estimated a capitalized subsidy value on their MBSs of $19.5 billion over the same period.

With the passage of the Housing and Economic Recovery Act of 2008, federal backing of Fannie Mae and Freddie Mac became explicit, and CBO began to include estimates of the fair-value subsidies associated with their new mortgage guarantees in its budget baseline (CBO 2010a). In the years following the financial crisis, it has become more difficult to identify the fair value of government backing by reference to market prices because very few mortgages have been privately insured. However, some jumbo mortgages continue to be offered by private entities. The subsidy value can be estimated by attributing a portion of the observed spread between jumbo and conforming mortgages (those eligible for purchase by Fannie Mae and Freddie Mac) to the value of the guarantees and capitalizing that spread over the expected life of mortgages originated in a given year. CBO (2010c) highlights the quantitative significance of risk adjustment in evaluating those subsidies: Over a 10-year period starting in 2011, fair-value subsidies to Fannie Mae and Freddie Mac are projected to total $53 billion on a fair-value basis; using instead Treasury rates for discounting, Fannie Mae and Freddie Mac have a negative subsidy rate—they appear to earn $44 billion for the government.

### 3.2. Real Investments

Federal, state, and local governments make a variety of real investments that include infrastructure (highways, mass transit, aviation, water treatment, and flood control); structures (schools, office space, and military housing); and military equipment. Two federal enterprises, the Tennessee Valley Authority (TVA) and the Bonneville Power Administration (BPA), build and manage the electrical generation and transmission capacity that serve large regions of the Southeast and Pacific Northwest.

As discussed in Section 2.1, the logic of the Modigliani-Miller theorem implies that the government’s cost of capital should include a risk premium related to the market risk associated with such investments; governments can only borrow at low interest rates because the debt is secured by tax revenues. That observation is particularly important for projects that are justified on the basis that user fees will cover costs. For example, electrical
rates charged by TVA and BPA include expected debt servicing costs, but not the risk to taxpayers that because of lower-than-expected demand there could be a revenue shortfall that would be borne by taxpayers (see Pope 2008 for an account of how BPA managed nuclear power plant cost overruns).

In general, public entities do not recognize a cost of taxpayer equity in assessing their capital costs. At the federal level, the Office of Management and Budget (OMB) is responsible for providing guidance to other federal agencies on the discount rates to be used for cost-benefit analyses. In its published procedures, it explains that discounting is necessary to account for the time value of money, but it makes no mention of adjusting for risk (OMB 1992). Accordingly, OMB specifies the use of Treasury note or bond rates for discounting nominal cash flows; for discounting real cash flows it publishes a schedule of real rates based on Treasury rates adjusted for projections of expected inflation.

State and local governments, and other government entities, also generally take their cost of capital to be the average interest rate on their debt. Those rates may be lower or higher than Treasury rates depending on whether the value of any tax exemptions exceeds the costs of higher default risk and lower liquidity. In any case, because no cost is recognized for taxpayer equity, the cost of capital used in project evaluation is significantly lower than what it would be for a private enterprise evaluating the same project. Comprehensive estimates have not been published on how much capital costs for real government investments are understated, nor have researchers evaluated how much that downward bias has affected the government’s investment decisions.

3.3. Defined-Benefit Pension Plans and Social Security

Governments promise pension benefits to their employees and social security benefits to retired workers and their dependants. Policymakers rely on actuaries’ present value calculations to assess whether income from dedicated investment portfolios and projected tax revenues will be sufficient to cover the promised benefits, and if not how large the adjustments to the system need to be to restore balance. Because of the long time horizons involved, the conclusions are highly sensitive to the rates used to discount projected benefits and tax revenues.

The principle of matching discount rates to the risk of the cash flows being discounted also applies to retirement-related cash flows. If accrued public pension benefits are as safe and certain as the other debt obligations of a government, then they should be discounted at a similar rate (with adjustments to undo the effect of tax exemptions). Similarly, pension fund assets should be valued at market prices, which reflect the higher discount rates that investors assign to riskier investments.

That principle is violated by the guidelines issued by the Government Accounting Standards Board (GASB) for accounting for state and local defined-benefit pension plans. GASB allows projected pension benefits to be discounted at the expected rate of return on pension fund assets, even though the assets are composed primarily of stocks and other securities that are considerably riskier than the pension liabilities. Using the rate of return on risky assets to discount safe cash flows understates their value and therefore understates the funding shortfalls of public sector pension plans. Novy-Marx & Rauh (2011) estimate the amount by which pension underfunding is understated, redoing the present value calculations using a tax-adjusted muni rate (representing the value of taxpayer liabilities). Their calculations using tax-adjusted muni rates show that in
2008, economic underfunding was approximately $300 billion more than official estimates reported. Rather than being fixed dollar annuities, defined-benefit pension promises to current workers are generally subject to market risk. The reason is that even when there is no risk of default by a plan sponsor, the formula that determines the benefit amount is linked to future wage realizations. Future wages are correlated with future stock market outcomes, and that correlation tends to increase with the time horizon (Lucas & Zeldes 2006; Benzoni, Collin-Dufresne & Goldstein 2007). Hence some measures of defined-benefit pension benefits are exposed to market risk particularly in the long-run, and the discount rates applied to them need to be adjusted accordingly.

Taking into account long-run risk and its effect on discount rates is particularly important for evaluating the solvency of the social security system. Social security benefits are tied by formula to aggregate wage growth over an individual's working life, and taxes collected each year are proportional to aggregate wages. Different discount rates apply to different cohorts: The benefits eventually received by young workers are subject to decades of aggregate wage risk, whereas the benefits received by retirees are no longer exposed to wage risk. Taking into account the age structure of the population and the time variation in the correlation between wage growth and asset returns, Geanakoplos & Zeldes (2010, 2011) show that the present value of projected benefits is significantly lower when discount rates are risk-adjusted than they are under an actuarial approach that uses Treasury interest rates for discounting. For example, the present value of benefits for a closed group (which includes the lifetime taxes and benefits of all people currently in the labor force) is estimated to have a market value of $19.5 trillion as compared to a much higher actuarial value of $30 trillion. However, risk adjustment also lowers the present value of social security tax revenues relative to their actuarial value. The net effect of adjusting for market risk is to lower the present value of projected revenue shortfalls for the closed group: The market value of the shortfall is estimated to be $8.1 trillion, whereas the actuarial value is $13.7 trillion. Although including a risk premium reduces the present value of both social security taxes and benefits, because the taxes are collected before benefits are received, the effect of compounding the risk premium reduces the relative cost of benefits.

4. APPLICATIONS OF DERIVATIVE PRICING TECHNIQUES

Many of the government's financial commitments are contingent claims—derivatives whose value can be inferred from the observed prices and volatilities of privately issued claims using derivative pricing techniques (making appropriate adjustments for the distinct characteristics of government activities). That insight has been applied to a variety of applications, which are briefly surveyed here.

---

5 They also report estimates using Treasury rates to discount liabilities, but because pension liabilities are not as safe or liquid as Treasury securities, that calculation overstates the liability to taxpayers and the value to beneficiaries.

6 In a related analysis, Blocker, Kotlikoff & Ross (2008) conclude that risk adjustment makes unfunded social security liabilities larger rather than smaller. Their analysis does not consider the correlation between wage growth and financial market returns. Instead they focus on the value of inflation protection provided to retirees and use the spread between nominal and inflation-protected Treasury securities to estimate the value of that inflation protection, which by that measure appears to be very valuable.
4.1. Loan Guarantees to Firms and Deposit Insurance

A comparison across two firms with identical assets—but one with a government debt guarantee and one without a guarantee—serves to illustrate how a government guarantee of a firm’s debt affects the value of its debt and equity, and also to identify the value of the debt guarantee. For a firm with guaranteed debt, equity value has two components: The first, analogous to the equity of a levered firm without a guarantee, is a call option on the operating assets of the firm; if the asset value is higher than the face value of the debt at maturity, equity holders receive the difference. The second component is the net value of the guarantee itself, which is the present value of the uncertain stream of savings arising from being able to borrow at the risk-free rate rather than at a rate that includes a risk premium, net of the value of any fees charged. The Appendix provides an algebraic example that formalizes those conclusions, and which shows that the guarantee can be valued as a put option.

Merton (1977) first demonstrates the correspondence between loan guarantees and common stock put options and uses that identification to derive a formula to value loan guarantees as put options. Merton (1978) adapts the analysis to deposit insurance by incorporating the effect of costly audits that occur at random intervals over an indefinite period of time. Those analyses build on Merton (1974), which provides a pricing formula for risky corporate debt based on the insight that the debt can be viewed as a portfolio consisting of risk-free debt and a short put option on the assets of the firm.7

Marcus & Shaked (1984) estimate the fair value of FDIC insurance using the Merton (1977) model calibrated with data on 40 publicly traded banks and bank holding companies. They conclude (in contrast to several early studies) that the fair value of FDIC insurance is considerably lower than the premiums charged. They also emphasize that the large differences in estimated guarantee values across banks imply that cross-subsidies could be reduced by greater risk adjustment of premiums by the FDIC.

In that analysis, Marcus & Shaked encounter two practical challenges that often arise when valuing government guarantees to firms using an options pricing approach. The first is how to impute the volatility of a guaranteed firm’s asset value. Whereas data on equity values and volatilities are generally available for publicly traded firms, the market value of debt is rarely reported, and hence asset value cannot be directly measured. To solve that problem they rely on an implicit function derived in Merton (1974) that relates the volatility of assets to the volatility of equity. That formula, together with an identity that equates the sum of a firm’s debt and equity to the value of firm assets (inclusive of the guarantee value), can be solved numerically to approximate the value of a firm’s assets and their volatility.

The second difficulty is that data on the value and volatility of equity are not available for privately held firms. To estimate the value of guarantees in such cases, the choices are either to assume that privately held firms are analogous to similar publicly traded firms, or to use a combination of data from public and private firms to infer values for the key input parameters in the pricing model. Falkenheim & Pennacchi (2003) take the latter approach to valuing private banks’ deposit insurance; they predict the risk characteristics of private depository institutions based on supervisory accounting data.

---

7Sosin (1980) uses those techniques to analyze the value of federal loan guarantees to corporations. Specifically, he considers a guarantee on a portion of a hypothetical firm’s subordinated debt and its effects on the value of different classes of firm claims. CBO (2004) uses a binomial version of the model to value the federal guarantees made to Chrysler in 1980 and to America West Airlines in 2002 and the associated warrants and fees received by the government in exchange.
The studies discussed thus far take firm leverage ratios and asset volatilities as exogenous processes. Both, however, are influenced by the behavior of firms and regulators, which in turn is influenced by the presence of guarantees. Pennacchi (1987) reexamines the value of deposit insurance, taking into account the response of regulators. Specifically, he considers the effect on the value of the guarantee if at the time of an audit the regulator can force a bank to restore capital to at least its regulatory minimum. The wave of savings and loan bankruptcies during the mid-1980s increased the attention paid to the incentives for risk-taking by guaranteed institutions. Keeley (1990) presents evidence that bank risk-taking, and hence the value of deposit insurance, is greater when charter value declines. Pennacchi (1996) points out that when deposit insurance premiums are set to be “actuarially fair,” banks have incentives to take on excessive systemic (priced) risk.

4.2. Pension Benefit and Social Security Guarantees

As with deposit insurance, retirement benefit guarantees can be valued as put options. The Pension Benefit Guarantee Corporation (PBGC), an independent federal agency, guarantees the obligations of corporate defined-benefit pension plans. Those defined-benefit pension plans promise retirees a stream of income for life, based on years of service and wages in the last few working years. Corporations are required to hold dedicated portfolios of pension assets to fund their liabilities. However, if plan assets prove to be insufficient because of low returns or insufficient contributions, companies still must make the promised payments as long as they have the means to do so—the PBGC only becomes responsible for a company’s pension liabilities when pension assets are insufficient and the company is insolvent. That situation is most likely to occur when the stock market has fallen and corporate default rates are high. Hence, PBGC guarantees expose the government to considerable market risk.

Marcus (1987), Pennacchi & Lewis (1994), and CBO (2005) estimate the value of PBGC insurance, taking into account the dependence of the government’s liability on a random termination date for each firm due to bankruptcy, current funding levels, and the stochastic value of plan assets. The CBO model incorporates more programmatic information than those earlier studies and also takes into account the value of insurance premiums received. CBO reports that the effect of incorporating market risk doubles the net cost to the PBGC from underpriced premiums relative to an actuarial estimate that uses Treasury rates for discounting. CBO also finds that PBGC premiums, which are set by statute, are extremely underpriced; premiums would have to be increased more than sixfold to cover the present value shortfall from projected future claims (existing losses are sunk and not included in that calculation). Similarly to deposit insurance, the underpricing of PBGC guarantees encourages overinvestment in risky assets, which could be destabilizing to the financial system (Bodie 2011).

Governments also may explicitly or implicitly provide minimum return guarantees on defined contribution pension accounts, whose returns depend on investment realizations. Proposals to include such accounts as part of social security, and the expectation that in the event of unexpectedly poor performance the government would offset a portion of losses, have motivated several studies on the cost of such guarantees (e.g., Pennacchi 1999; Lachance & Mitchell 2002; Biggs, Burdick & Smetters 2006; CBO 2006). Those analyses demonstrate the applicability of derivative pricing methods to valuing minimum return guarantees on defined contribution accounts. Calculations based
on specific proposals illustrate the high cost of such guarantees and the sensitivity of cost to program design. Importantly, the analyses highlight the moral hazard that is created when guarantee fees are underpriced or not risk-adjusted: Participants have a strong incentive to invest in high-risk assets because they get the upside but not the downside of the risk.

4.3. Incorporating Capital Structure Dynamics: Fannie Mae and Freddie Mac

The estimated value of open-ended debt guarantees on highly levered financial institutions—such as deposit insurance and implicit guarantees on the government-sponsored enterprises like Fannie Mae and Freddie Mac—depends critically on assumptions about firm capital structure and how it responds to profitability and other shocks. In an influential analysis, Leland (1994) solves for the value of corporate debt when firm asset value follows a diffusion process and capital structure is set optimally. Commercial risk assessment tools such as the framework used by Moody’s KMV also take into account the joint dynamics of assets and liabilities for evaluating the probability of default.

Using a risk-neutral stochastic simulation approach, Lucas & McDonald (2006) estimate the value of the implicit government guarantee on the $1.7 trillion of debt issued by Fannie Mae and Freddie Mac as of year-end 2004. To capture the idea that managers may gamble for solvency when default appears imminent, asset volatility is assumed to increase discretely when leverage exceeds a threshold. The preferred parameterization yields a guarantee value of less than $8 billion over a 10-year period for the two enterprises. The effect of risk adjustment is significant: The actual 10-year default probability for Fannie Mae is estimated to be 6.4%, whereas the corresponding risk-neutral default probability is 15.2%. The combined value at risk at the 0.5% level over the same period was estimated to be approximately $100 billion (less than the ex post amount of Treasury infusions into the companies after they entered conservatorship in 2008).

Marcus & Shaked (1984), Lucas & McDonald (2006), and other studies that use derivative pricing techniques to value guarantees to corporations tend to produce cost estimates that are lower than analyses (such as those discussed in Section 3.1) based on capitalizing interest rate spreads. Lucas & McDonald (2010) suggest several possible explanations for that phenomenon: A federal guarantee may be valued by investors not just because of the direct value of protection from default risk, but also because of other benefits such as increased liquidity or exemptions from regulatory restrictions. Spread-based analyses also may not account for the fact that if asset volatility is held constant, firms with higher charter values will optimally default less frequently than those without guarantees that have lower charter value.

The presence of a government guarantee also may affect the asset price dynamics that are used to estimate the guarantee’s value, which could lead to incorrect inferences about cost. Lucas & McDonald (2010) explore that possibility and conclude that inferences about the volatility of operating assets made on the basis of stock price volatility are basically the same for a firm with or without a guarantee. However, because the firm’s assets include the value of the guarantee, inferences about expected recoveries in the event of a default must take into account the drop in value due to the loss of charter value.

Other financial institutions thought to be implicitly guaranteed include too-big-to-fail financial institutions, the Federal Home Loan Banks, and the Farm Credit System.
4.4. Other Applications

The rules for many government programs (such as eligibility criteria, fee schedules, and payoff triggers on guarantees) are only reevaluated periodically or may be set by law and hence may remain in effect for extensive periods. That friction creates optionality that generally increases government costs. For example, the value of assistance fluctuates with economic conditions and program participation increases with its value. Several studies, including Marcus & Modest (1986), Lucas & Moore (2009), and CBO (2010b), have incorporated additional optionality into estimates of program cost.

Marcus & Modest (1986) analyze agricultural price supports, whose value depends on future supply and demand conditions in commodity markets. They show that the US agricultural price support system can be interpreted as the provision of a random number of put options to program beneficiaries. Using a derivatives pricing methodology, they derive and calibrate a valuation formula and find that the support program raises the ex ante value of some crops by as much as 9% (at a corresponding cost to the government).

Lucas & Moore (2009) estimate the cost to the government of the student loan consolidation option. The consolidation option is a swaption, which allows a borrower to convert a federal student loan that carries a floating rate into a fixed-rate loan with the same rate. Using a stochastic risk-neutral model of the yield curve and Monte Carlo simulation, the option value is shown to be sensitive to the level and shape of the yield curve and to the behavior of borrowers. Borrower behavior is estimated using historical loan-level administrative data from the Department of Education. For the period 1998 to 2005, the value of the option at the time of loan origination varies between 1.2% and 6.4% of loan principal, depending on interest rate conditions in the year of loan origination. Although the observed propensity to exercise the option increases with option value, borrowers do not follow an optimal exercise policy. Basing the cost estimates on a behavioral model rather than assuming a counterfactual but optimal take-up rate roughly halves the estimated cost to the government.

During the peak of the financial crisis in 2008, the Federal Reserve (Fed) instituted several emergency lending programs that provided government subsidies to borrowers in the form of subsidized put options (CBO 2010b). For example, under its Term Asset-Backed Securities Loan Facility, the Fed stood ready to make multiyear nonrecourse loans to financial institutions that were collateralized by asset-backed securities of various types. The Fed was partially protected from losses by a $20 billion first-loss guarantee from the Treasury under the Troubled Asset Relief Program and by haircut provisions. The Fed initially capped the facility size at $200 billion but later increased the limit to $1 trillion. CBO estimated the fair-value subsidy provided by the Fed initially to be $13 billion. That estimate was constructed using a risk-neutral asset process for each collateral type that was consistent with market yields in the months preceding program inception. CBO then used Monte Carlo simulations of the calibrated asset processes to value the cash flows to and from the Federal Reserve and the Treasury. The analysis took into account the contractual structure; the effect of haircuts; and, importantly, the expectation that program take-up rates would increase if market conditions deteriorated.

---

9A risk-neutral approach is a technique whereby the physical probability of default is replaced with weights that combine the physical default probability with risk adjustment. An advantage is that expected cash flows calculated under a risk-neutral measure can be discounted using risk-free rates, which makes estimation using Monte Carlo simulation relatively straightforward.

10A haircut is the difference between the value of the collateral and the principal lent against it.
Congress responded to the financial crisis by instituting the Troubled Asset Relief Program, which provided up to $700 billion for purchase of troubled assets by the government. That legislation required the costs to be evaluated using risk-adjusted discount rates, and both CBO and OMB provided cost estimates on that basis. Veronesi & Zingales (2009), and a study commissioned by the Congressional Oversight Panel, also evaluated the cost of the government’s preferred stock purchases and warrants received under that program using a market approach.

As a final example of where a derivatives pricing approach has been applied to a large government program, CBO (2011a) estimates fair values for the mortgage guarantees made by the Federal Housing Administration (FHA) and contrasts the results with budgetary estimates of program cost that use Treasury rates for discounting expected losses. Demand for FHA mortgages increased markedly with the withdrawal from the market of subprime lenders following the financial crisis of the late 2000s; since 2009 it has guaranteed more than 17% of new and refinanced mortgages. Because comparable price information is not available for new subprime mortgages, CBO uses the quoted rate schedules for private mortgage insurance (PMI) to infer the market price of mortgage default risk. Borrowers taking out mortgages with less than a 20% down payment must purchase PMI for the mortgages to be eligible for purchase by Fannie Mae and Freddie Mac, and those insurers are in a first-loss position. CBO estimated that on a fair-value basis, the program would have a cost in 2012 of $3.5 billion. By contrast, discounting projected losses at Treasury rates (as required by law), CBO estimated that the budgetary savings would be $4.4 billion.

5. CONCLUSIONS

This article reviews the rationales for using market or fair-value prices for valuing government projects and policies and surveys much of the existing research that applies the concepts and tools of modern finance to that end. The main points are that

- Cost estimates serve as the price system for government decision makers. Those estimates influence the allocation of trillions of dollars of real and financial resources.
- The government’s economic cost of capital includes the cost of the associated market risk because taxpayers and other government stakeholders must bear that risk.
- Governments typically understate their cost of capital because they identify it with their borrowing costs rather than with a rate of return commensurate with the risk of a project. A consequence is that the official cost estimates for many government investment and financial activities are significantly understated. However, in a few cases risk adjustment lowers estimated cost relative to official estimates.
- Using the methods of financial economics to value government projects and policies provides more comprehensive cost estimates and also serves to highlight the underlying economics of the activities analyzed. Researchers have successfully applied those methods to a wide range of applications ranging from pension guarantees to student loans to Fannie Mae and Freddie Mac.

Despite the progress that has been made, there is a great deal of work that remains to be done in this area. On the practical side, many major government projects and policies have yet to be evaluated using a financial economics approach, for example, guarantee programs for multifamily housing and trade credit. It also is not known how much capital costs for real government investments are understated, and how much that downward bias has affected
real investment decisions (in specific cases or in aggregate). Although there is an existing literature on the cost of the largest credit programs, those estimates and methodologies could be updated and improved upon. An impediment to this line of research is that government financial data are not routinely made public. However, researchers have successfully used the Freedom of Information Act to obtain data from the federal government, and the additional effort required increases the odds that analysis of the data will produce new insights.

There are also important conceptual issues that remain to be further explored including

- To what extent do market prices reflect the full cost of the catastrophic or tail risks that the government assumes, and what prices provide the best information to infer the cost to the government of those risks?
- How much do government actions—such as the large scale purchases of mortgage-backed securities by the Federal Reserve—move prices, and how should those effects be incorporated into cost estimates?
- How can the sometimes significant discrepancies between options-based and rate spread-based models be reconciled, and which approach is more relevant to government valuation?
- Are there identifiable components of market returns that should be excluded from calculations of government capital costs? For example, is illiquidity less of a cost to the government?
- Are the accounting guidelines for fair-value estimates by private financial institutions the best framework to guide government cost calculations, and if not what modifications are needed?

Finally, although ex ante cost estimates are most relevant for decision-making, policymakers and the press often focus on ex post costs. For government guarantees, the median and modal ex post cost generally are lower than the estimated ex ante cost, because the risk premium is a noncash expense and because the distribution of outcomes is highly left-skewed. How to effectively communicate the relevance of estimates that are systematically higher than observed cash costs remains an important challenge for researchers in this area.

**DISCLOSURE STATEMENT**

The author is not aware of any affiliations, memberships, funding, or financial holdings that might be perceived as affecting the objectivity of this review.

**LITERATURE CITED**


APPENDIX

To see the equivalence between a debt guarantee and a put option on the assets of a firm, consider an insured firm and otherwise identical uninsured firm (denoted with superscripts $I$ and $U$, respectively; quantities without superscripts are the same for both). (The example is taken from Lucas & McDonald 2010.) Suppose that at time $0$ each promises the same debt payment at maturity $T$, $D_0(T)$, and has the same initial value of operating assets, $A_0(0)$. The only source of uncertainty is the value of operating assets, which evolve identically but stochastically over time. At time $0$, the equity value of the going concern is the present value of the expected payoff to equity holders. Let $E_0[\cdot]$ denote the expectation conditional on time $0$ information under the risk-neutral measure. Because both firms have the same physical assets and the same promised debt repayment, the market value of equity of both firms is $E_0(0) = e^{-rT}E_0[\max(0, A_0(T) - D_0(T))]$, where $r$ is the risk-free rate. Between times $0$ and $T$, the equity values remain the same: Both claims are a call option on the same underlying assets, with identical strike price and maturity.

Unlike for equity, the present value of the debt of the two firms prior to maturity is not equal. At any time $t \leq T$, the value of insured debt is the present value of the certain payment: $D_I(t) = e^{-r(T-t)}D_0(T)$. The realized payment on uninsured debt will be the promised amount, $D_0(T)$, or the asset value at time $T$, $A_0(T)$, whichever is less. Hence, the value of uninsured debt is the present value of the expected payment to debt holders: $D_U(t) = e^{-r(T-t)}E_t[\min(A_0(T), D_0(T))]$.

The value of the $T$-period guarantee made at time $0$, $G_0(0)$, is the difference between the initial value of the insured and uninsured debt:

$$G_0(0) = e^{-rT}D_0(T) - e^{-rT}E_0[\min(A_0(T), D_0(T))] = e^{-rT}E_0[\max(D_0(T) - A_0(T), 0)].$$

(1)

The expression on the right-hand side of Equation 1 is the value of a put option on the operating assets of the firm, where the strike price is the promised payment on debt. When assets are lognormally distributed, the value can be computed using the standard Black-Scholes formula for a put option.

The value of the guarantee generally accrues to equity holders. If the government charges fees for the guarantee, then the present value of the fees will partially or fully offset the value of the guarantee to equity holders.
Contents

Implications of the Dodd-Frank Act
Viral V. Acharya and Matthew Richardson ........................................... 1

Valuation of Government Policies and Projects
Deborah Lucas ................................................................. 39

The Impacts of Automation and High Frequency Trading
on Market Quality
Robert Litzenberger, Jeff Castura, and Richard Gorelick .................... 59

Shadow Banking Regulation
Tobias Adrian and Adam B. Ashcraft .............................................. 99

Narrow Banking
George Pennacchi ................................................................. 141

Federal Reserve Liquidity Provision during the Financial Crisis
of 2007–2009
Michael J. Fleming .............................................................. 161

Efficient Markets and the Law: A Predictable Past
and an Uncertain Future
Henry T.C. Hu ................................................................. 179

Corporate Governance of Financial Institutions
Hamid Mehran and Lindsay Mollineaux .............................................. 215

Corporate Finance and Financial Institutions
Mark J. Flannery ............................................................... 233

A Survey of Systemic Risk Analytics
Dimitrios Bisias, Mark Flood, Andrew W. Lo,
and Stavros Valavanis ............................................................ 255

Sovereign and Financial-Sector Risk: Measurement and Interactions
Dale F. Gray and Samuel W. Malone .............................................. 297
Regime Changes and Financial Markets
Andrew Ang and Allan Timmermann .......................... 313

The Real Effects of Financial Markets
Philip Bond, Alex Edmans, and Itay Goldstein .................. 339

Economic Activity of Firms and Asset Prices
Leonid Kogan and Dimitris Papanikolaou ........................ 361

Consumption-Based Asset Pricing Models
Rajnish Mehra .......................................................... 385

Taxes and Investment Choice
Robert M. Dammon and Chester S. Spatt ..................... 411

Closed-End Funds: A Survey
Martin Cherkes ......................................................... 431

Commodity Investing
K. Geert Rouwenhorst and Ke Tang .............................. 447

Market Microstructure and the Profitability of Currency Trading
Carol Osler .............................................................. 469

Errata
An online log of corrections to Annual Review of Financial Economics articles may be found at http://financial.annualreviews.org
New From Annual Reviews:

**Annual Review of Statistics and Its Application**

*Volume 1 ● Online January 2014 ● http://statistics.annualreviews.org*

Editor: **Stephen E. Fienberg, Carnegie Mellon University**

Associate Editors: **Nancy Reid, University of Toronto**

**Stephen M. Stigler, University of Chicago**

The *Annual Review of Statistics and Its Application* aims to inform statisticians and quantitative methodologists, as well as all scientists and users of statistics about major methodological advances and the computational tools that allow for their implementation. It will include developments in the field of statistics, including theoretical statistical underpinnings of new methodology, as well as developments in specific application domains such as biostatistics and bioinformatics, economics, machine learning, psychology, sociology, and aspects of the physical sciences.

**Complimentary online access to the first volume will be available until January 2015.**

**TABLE OF CONTENTS:**

- **What Is Statistics?** Stephen E. Fienberg
- A Systematic Statistical Approach to Evaluating Evidence from Observational Studies, David Madigan, Paul E. Stang, Jesse A. Berlin, Martijn Schuemie, J. Marc Overhage, Marc A. Suchard, Bill Dumouchel, Abraham G. Hartzema, Patrick B. Ryan
- The Role of Statistics in the Discovery of a Higgs Boson, David A. van Dyk
- Brain Imaging Analysis, F. DuBois Bowman
- Statistics and Climate, Peter Guttorp
- Climate Simulators and Climate Projections, Jonathan Rougier, Michael Goldstein
- Probabilistic Forecasting, Tilmann Gneiting, Matthias Katzfuss
- Bayesian Computational Tools, Christian P. Robert
- Bayesian Computation Via Markov Chain Monte Carlo, Radu V. Craiu, Jeffrey S. Rosenthal
- Build, Compute, Critique, Repeat: Data Analysis with Latent Variable Models, David M. Blei
- Structured Regularizers for High-Dimensional Problems: Statistical and Computational Issues, Martin J. Wainwright
- High-Dimensional Statistics with a View Toward Applications in Biology, Peter Bühlmann, Markus Kalisch, Lukas Meier
- Next-Generation Statistical Genetics: Modeling, Penalization, and Optimization in High-Dimensional Data, Kenneth Lange, Jeanette C. Papp, Janet S. Sinsheimer, Eric M. Sobel
- Breaking Bad: Two Decades of Life-Course Data Analysis in Criminology, Developmental Psychology, and Beyond, Elena A. Erosheva, Ross L. Matsueda, Donatello Telesca
- Event History Analysis, Niels Keiding
- Statistical Evaluation of Forensic DNA Profile Evidence, Christopher D. Steele, David J. Balding
- Using League Table Rankings in Public Policy Formation: Statistical Issues, Harvey Goldstein
- Statistical Ecology, Ruth King
- Estimating the Number of Species in Microbial Diversity Studies, John Bunge, Amy Willis, Fiona Walsh
- Dynamic Treatment Regimes, Bibhas Chakraborty, Susan A. Murphy
- Statistics and Related Topics in Single-Molecule Biophysics, Hong Qian, S.C. Kou
- Statistics and Quantitative Risk Management for Banking and Insurance, Paul Embrechts, Marius Hofert

Access this and all other Annual Reviews journals via your institution at [www.annualreviews.org](http://www.annualreviews.org).