

# **Understanding Risk and Uncertainty: Making Decisions for Complex Problems**

**Baruch Fischhoff**

<http://www.cmu.edu/dietrich/sds/people/faculty/baruch-fischhoff.html>

Government-University-Industry Research Roundtable (GUIRR)  
National Academy of Sciences  
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# **How Do You Study Decision Making Under Uncertainty?**

# **Decision Science: Integrated Study of**

How people should make decisions  
(normative analysis)

How people do make decisions  
(descriptive research)

How to help people make better decisions  
(prescriptive interventions)

# **A non-disciplinary field, with contributions from**

psychology

economics

philosophy

sociology

operations research

neuroscience

political science

...

# Intellectual Roots

Ramsey/von Neumann & Morgenstern

utility theory

Raiffa/Edwards

decision analysis

Simon/March/Cyert

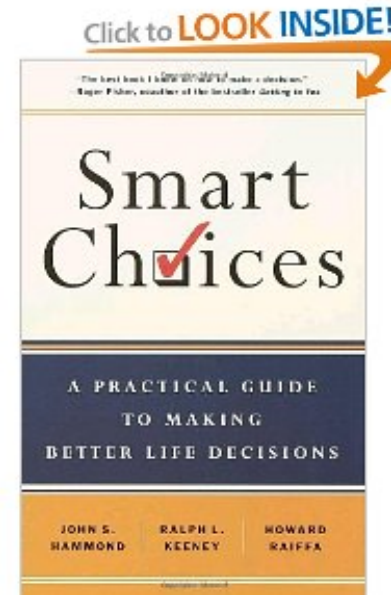
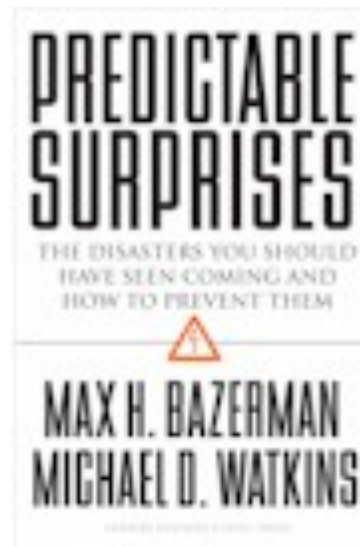
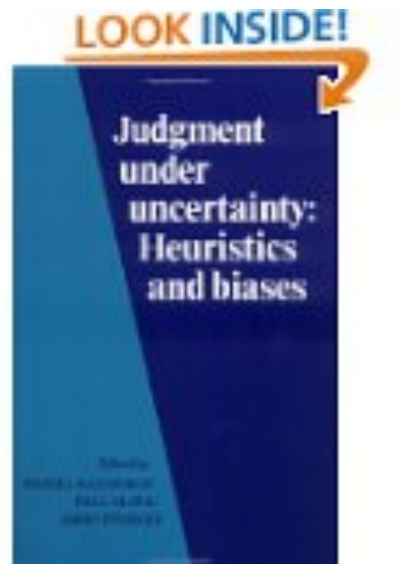
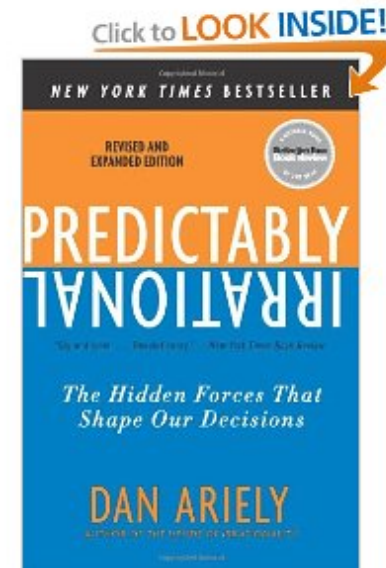
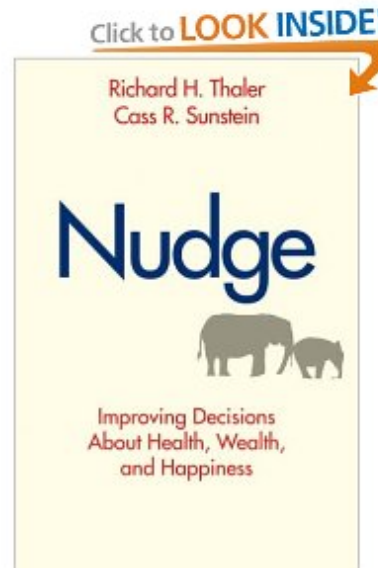
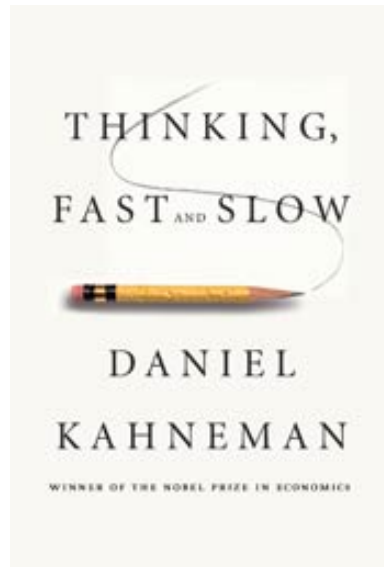
bounded rationality

Tversky & Kahneman

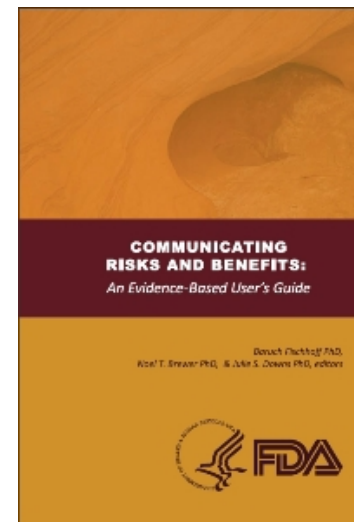
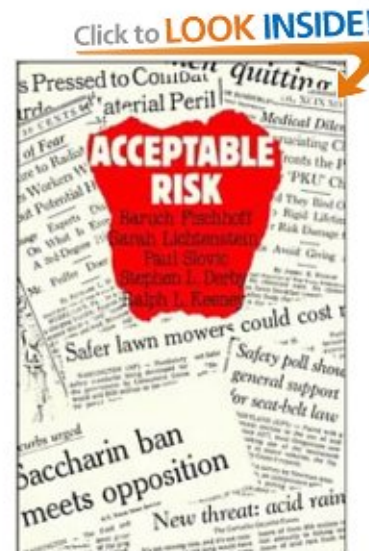
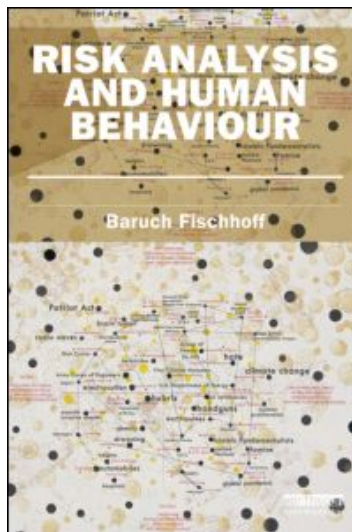
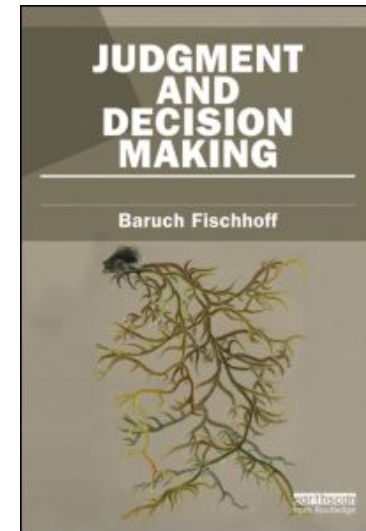
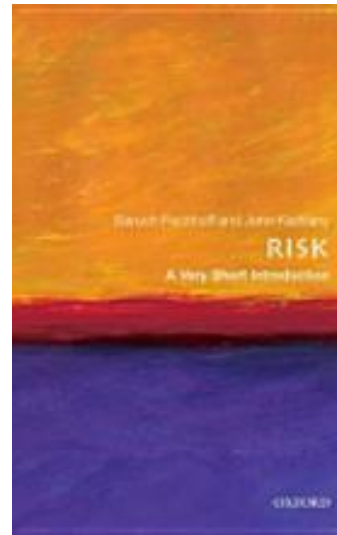
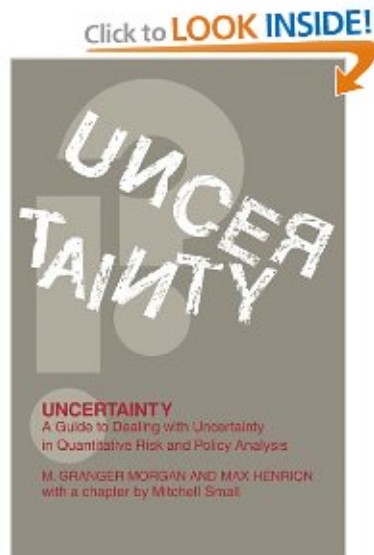
heuristics and biases

prospect theory

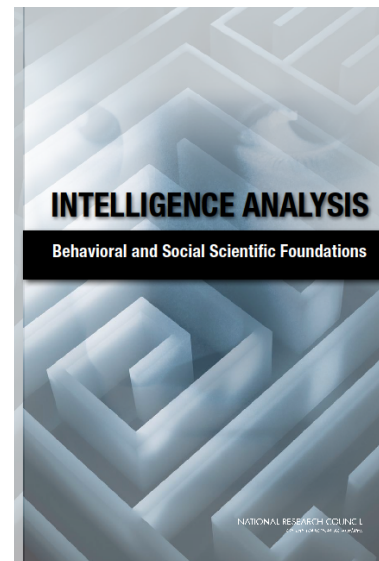
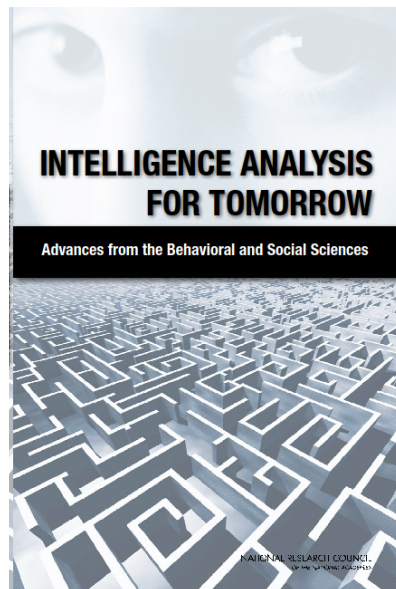
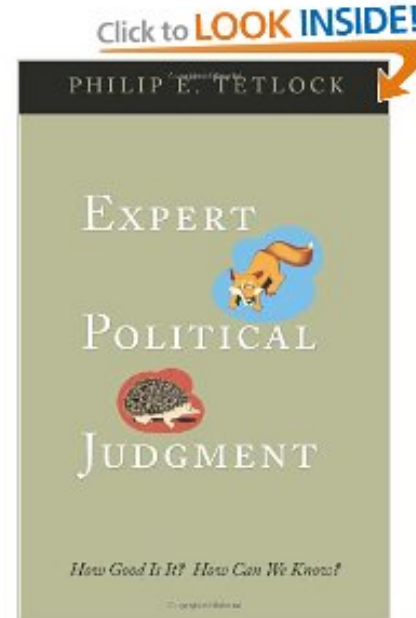
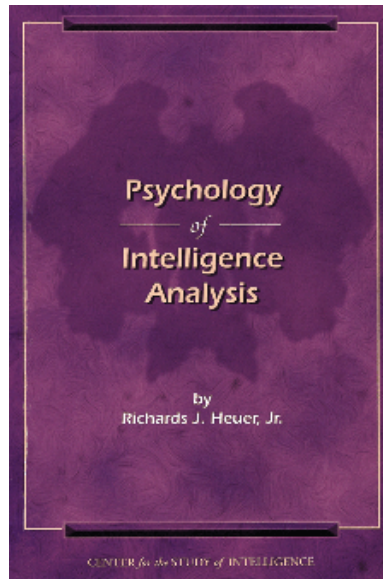
# Some of Our Colleagues' Books



# Some of Our Books



# Some on Intelligence Analysis





# **Some Results**

# **Decision Science Finds That**

Decision making follows simple principles.

# Some Principles of Judgment

People are good at tracking what they see,  
but not at detecting sample bias.

People have difficulty projecting non-  
linear trends.

People have limited ability to evaluate the  
extent of their own knowledge.

People have difficulty imagining themselves  
in other visceral states.

Transient emotions can affect perceptions,  
perhaps enough to tip close decisions.

## **Some Principles of Choice**

People consider the return on their investment in making decisions.

People dislike uncertainty.

People confuse ignorance and stupidity.

People are insensitive to opportunity costs.

People are prisoners to sunk costs, hating to recognize losses.

People may not know what they want, especially with novel questions.

# **Decision Science Finds That**

Decision making follows simple principles.

# Decision Science Finds That

Decision making follows simple principles.

However,

- the set of principles is large,

- the contextual triggers are subtle, and

- the interactions are complex

As a result, decision-specific research is needed.

# **Decision Science as an Engineering Science**

Applying basic analytical and behavioral principles, in conjunction with subject matter expertise, to problem solving and systems design.

# **With the Applications Essential to Scientific Progress**

Applied basic science

do we have predictions?

are they accurate?

Basic applied science

are we seeing something new?

can we domesticate it for basic  
research?

Alan Baddeley



## Some of Our Applications

plague

perchloroethylene

LNG

climate change

detergent

breast cancer

nuclear explosions

herpes (stigma)

xenotransplantation

smart meters

domestic radon

methylene chloride

EMF

UXO

violent radicalization

breast implants

nuclear power in space

Plan B (morning after pill)

neonates

vaccines (anthrax, MMR)

# **Some Typical Projects**

# Carotid Endarterectomy

**Problem:** medical informed consent

**Normative:** value-of-information analysis for ability of risk facts to affect patient decisions

**Descriptive:** [no trustworthy knowledge]

**Prescriptive:** focus on probabilities of death, stroke, and facial paralysis; on meaning of paralysis

Merz, J., Fischhoff, B., Mazur, D.J., & Fischbeck, P.S. (1993). Decision-analytic approach to developing standards of disclosure for medical informed consent. *Journal of Toxics and Liability*, 15, 191-215

# Paint Stripper

**Problem:** chemical labeling standards

**Normative:** diffusion-uptake model, predicting cumulative dose and peak levels

**Descriptive:** users willing to act, but confused over method effectiveness

**Prescriptive:** voluntary control perhaps impossible, without mandatory label design

Riley, D.M., Fischhoff, B., Small, M., & Fischbeck, P. (2001). Evaluating the effectiveness of risk-reduction strategies for consumer chemical products. *Risk Analysis*, 21, 357-369

# Sexual Assault

**Problem:** confident, universal, contradictory advice

**Normative:** meta-analysis of effectiveness studies

**Descriptive:** nuanced belief structure, differing goals, exaggerated effectiveness

**Prescriptive:** realistic expectations, societal responsibility, effectiveness research

Fischhoff, B. (1992). Giving advice: Decision theory perspectives on sexual assault. *American Psychologist*, 47, 577-58

# Cryptosporidium

**Problem:** emergency warning system

**Normative:** model of system performance,  
including detection, coordination, and  
consumer behavior

**Descriptive:** little knowledge in affected  
communities, useless knowledge among  
vulnerable individuals

**Prescriptive:** abandon warning system, provide  
services for vulnerable

Casman, E., Fischhoff, B., Palmgren, C., Small, M., & Wu, F. (2000). Integrated risk model of a drinking waterborne Cryptosporidiosis outbreak. *Risk Analysis*, 20, 493-509

# Getting Organized

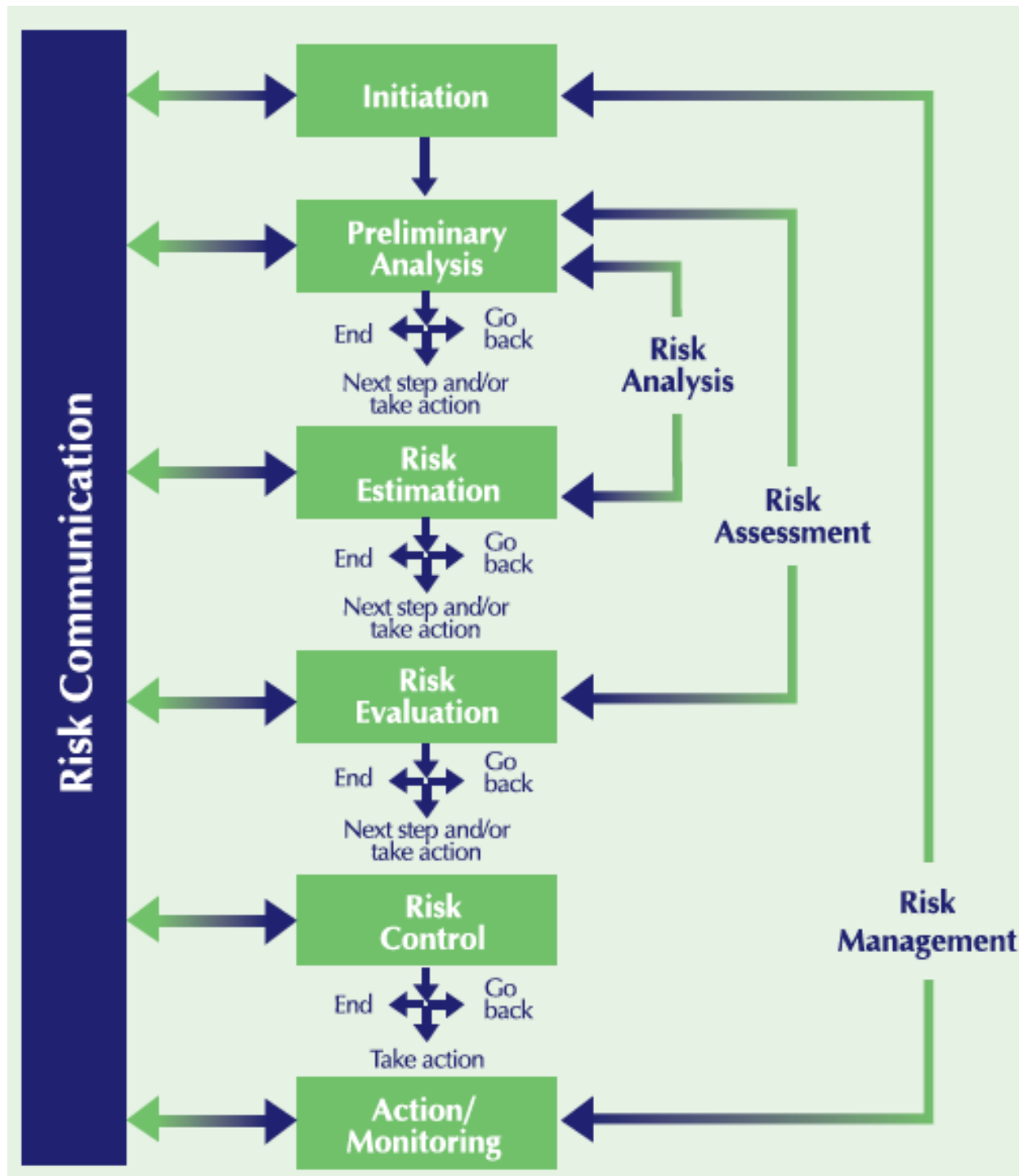


CAN/CSA-Q850-97  
***Risk Management:  
Guideline for  
Decision-Makers***

*A National Standard of  
Canada*







**FDA'S  
STRATEGIC PLAN  
FOR  
RISK COMMUNICATION**

Fall, 2009

# **Recommendations for Managing Emerging Events**

Have a consistent policy in all domains

Provide useful, timely information

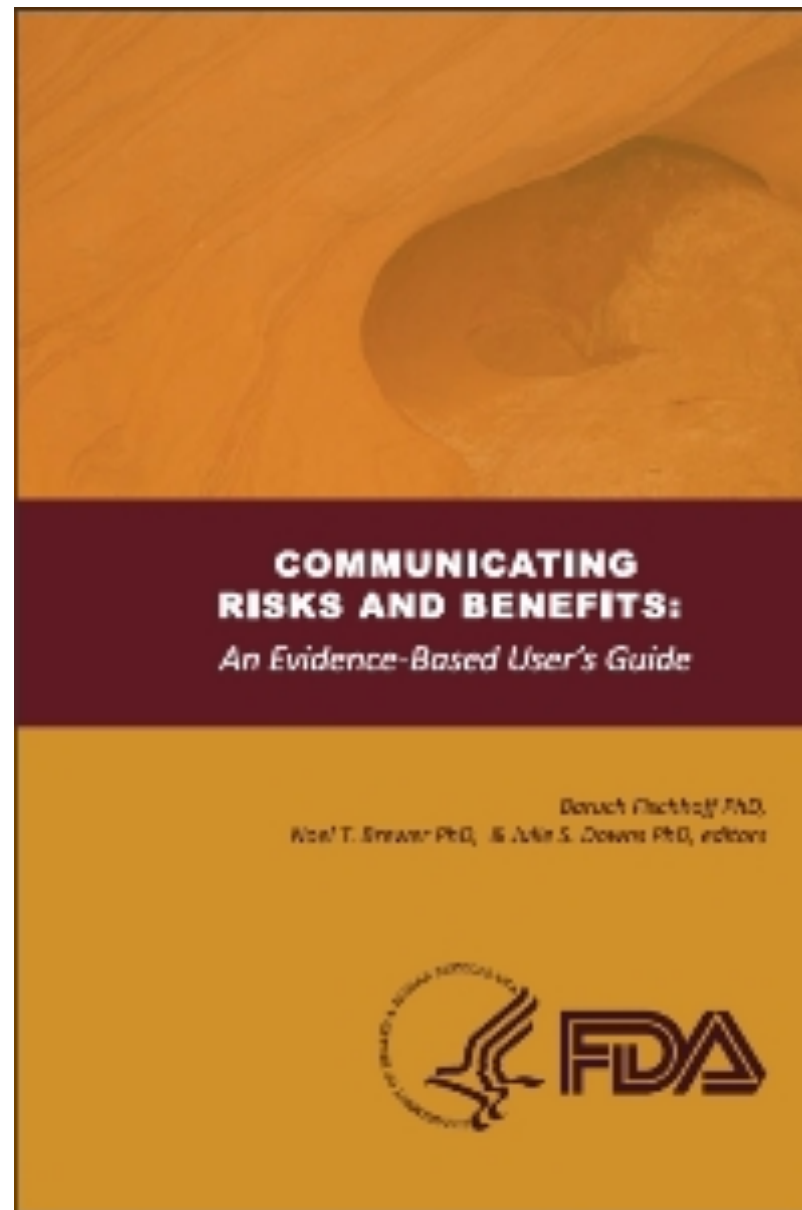
Address: risks and benefits, uncertainty,  
personal actions, FDA actions

Audience needs should drive agency  
analyses

Use standard formats; evaluate routinely

Consider needs of diverse populations

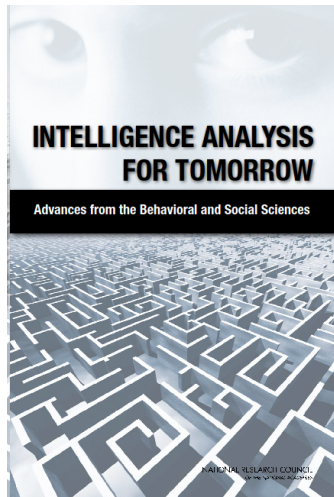
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<http://www.fda.gov/AboutFDA/ReportsManualsForms/Reports/ucm268078.htm>

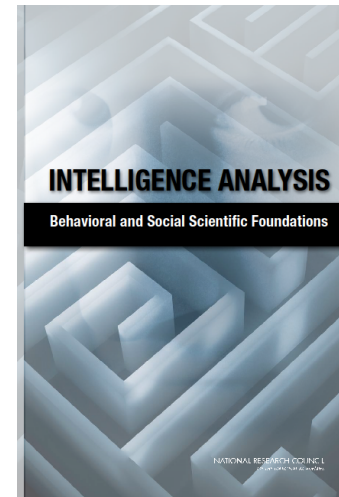
# Decision Science in Intelligence Analysis

## Consensus Report



Analysis, Recommendations,  
& Immediate Actions (100  
pages)

## Collection of Papers



Introduction to Methods  
and Evidentiary Base  
(350 pages)

Intelligence Analysis for Tomorrow: [http://www.nap.edu/catalog.php?record\\_id=13040](http://www.nap.edu/catalog.php?record_id=13040)

Intelligence Analysis: Behavioral and Social Scientific Foundations:

[http://www.nap.edu/catalog.php?record\\_id=13062](http://www.nap.edu/catalog.php?record_id=13062)

The National Academy of Sciences invites you to attend the  
**Arthur M. Sackler Colloquium on**



# THE SCIENCE OF SCIENCE COMMUNICATION

**May 21–22, 2012**

at the newly restored  
National Academy of Sciences building  
2101 Constitution Avenue, NW  
Washington, DC



<http://www.nasonline.org/programs/sackler-colloquia/upcoming-colloquia/science-communication.html>

# **Applications Require**

Domain specialists

Risk and decision analysts

Behavioral scientists

Policy/system analysts

# **Decision Science Resource Centers**

Provide publication-quality scientific support for designing, implementing, and empirically evaluating solutions.



# Decision Science Resource Centers

Provide publication-quality scientific support for designing, implementing, and empirically evaluating solutions.

- quality assurance
- economies of scope
- pool lessons learned
- anticipate problems
- involve academic researchers

### Books

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- Bazerman, M.H., & Watkins, H.D. (2004). *Predictable surprises*. Boston: Harvard Business School.
- Fischhoff, B. (2011). *Judgment and decision making*. London: Earthscan.
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- Tetlock, P. (2005). *Expert political judgment*. Princeton: Princeton University Press.

### Research Articles

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- Fischhoff, B., Atran, S., & Fischhoff, N. (2007). Counting casualties: A framework for respectful, useful records. *Journal of Risk and Uncertainty*, 34, 1-19.
- Fischhoff, B., Bruine de Bruin, W., Guvenc, U., Caruso, D., & Brilliant, L. (2006). Analyzing disaster risks and plans: An avian flu example. *Journal of Risk and Uncertainty*, 33, 133-151.
- Lanir, Z., & Kahneman, D. (2006). An experiment in decision analysis in Israel in 1975. *Studies in Intelligence*, 50(4).