

# The Value of Information in California's Emissions Inventory

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# The Value of Information

- More information -> Better policies
- The value of information varies according to:
  1. How uncertain decision makers are
  2. The value of the resources that are managed, monitored or regulated
  3. The range of options available to the decision maker
  4. Cost of using information
  5. The price of the next-best substitute for the information.

adapted from Maculey (2005)

# Emissions Inventory

**Table B-3 SO<sub>2</sub>, Annual and Averages**  
(in tons per day)

SUMMARY CATEGORY NAME	ANNUAL					WINTER				
	2005	2011	2012	2013	2014	2005	2009	2010	2011	2012
<b>STATIONARY SOURCES</b>										
FUEL COMBUSTION										
ELECTRIC UTILITIES	0.99	0.9	0.9	0.9	0.9	0.8	0.8	0.9	0.9	0.9
COGENERATION	0.67	0.7	0.7	0.7	0.7	0.6	0.7	0.7	0.7	0.7
OIL AND GAS PRODUCTION (COMBUSTION)	2.32	2.2	2.3	2.3	2.3	2.3	2.3	2.2	2.2	2.3
PETROLEUM REFINING (COMBUSTION)	0.11	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1	0.1
MANUFACTURING AND INDUSTRIAL	6.04	6.6	6.7	6.8	7.0	6.0	6.3	6.4	6.6	6.7
FOOD AND AGRICULTURAL PROCESSING	1.99	1.9	1.9	1.9	1.8	1.3	1.3	1.3	1.3	1.3
SERVICE AND COMMERCIAL	0.99	0.9	0.9	0.9	0.9	0.9	0.9	0.9	0.9	0.9
OTHER (FUEL COMBUSTION)	0.00	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0	0.0
* TOTAL FUEL COMBUSTION	<b>12.71</b>	<b>13.3</b>	<b>13.4</b>	<b>13.5</b>	<b>13.7</b>	<b>12.0</b>	<b>12.3</b>	<b>12.5</b>	<b>12.6</b>	<b>12.8</b>

# Emissions Inventory

- Created using:
  - travel demand models
  - surveys of point sources
  - biogenic models for emissions from plants
  - regressions from population or other proxy for area wide sources (dry cleaners, etc.)

# Air Pollution Basics

- The EPA sets standards for 6 common pollutants
- The National Ambient Air Quality Standards (NAAQS) are based on impacts to human health
- If a monitor registers pollution below the standard, it is in “attainment”
- If a state or a community is not making progress on air pollution, the federal EPA can step in

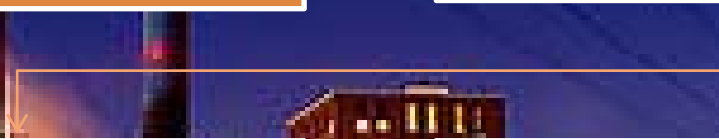
# EPA, ARB and SIPs, oh my!

EPA Sets NAAQS  
based on human  
health

Each state writes a  
State Implementation  
Plan (SIP)

Individual air districts  
(SJV APCD, SC AQMD,  
etc.) write rules for  
stationary sources

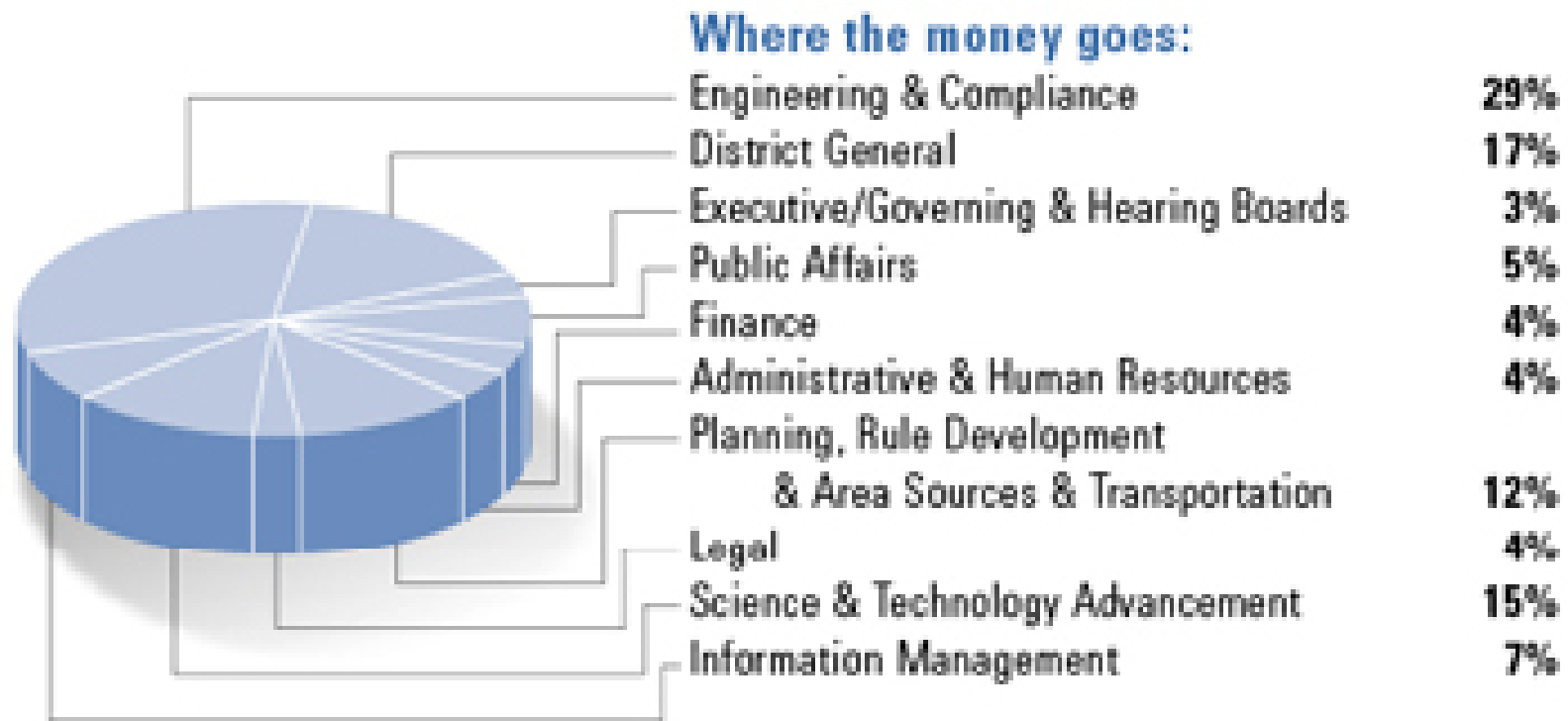
Emissions levels  
realized



# Local Air District Funding



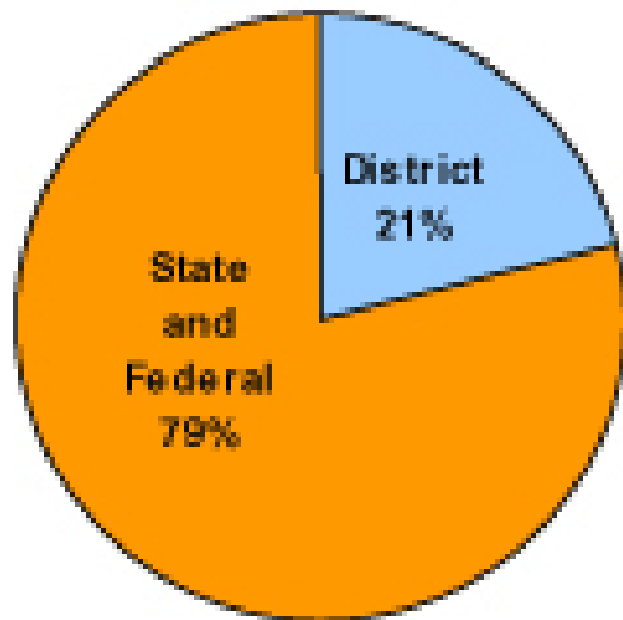
# Local Air District Expenditures



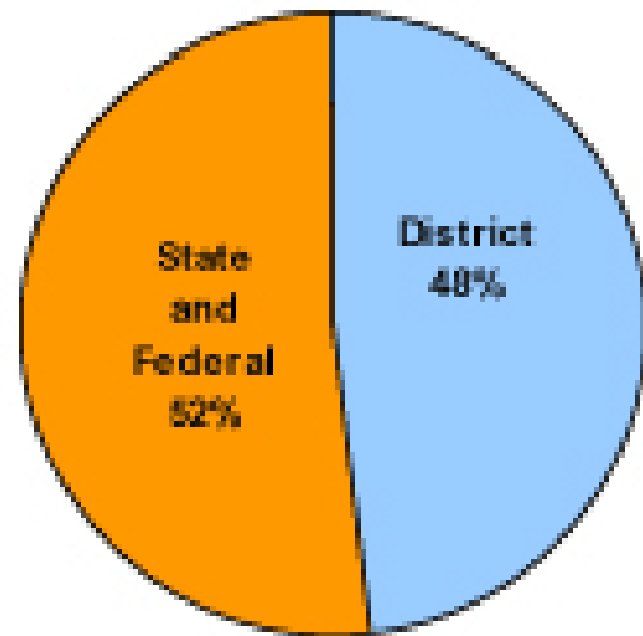


# SJV Jurisdictional Puzzle

Oxides of Nitrogen (NO<sub>x</sub>)



Volatile Organic Compounds (VOC)



# The Model

Air districts spend “effort” to reduce emissions

Subject to being 95% certain they are under the exogenous emissions target

# Static Model: Output Uncertainty

$$\text{Min}_{e_1, e_2} e_1 + e_2$$

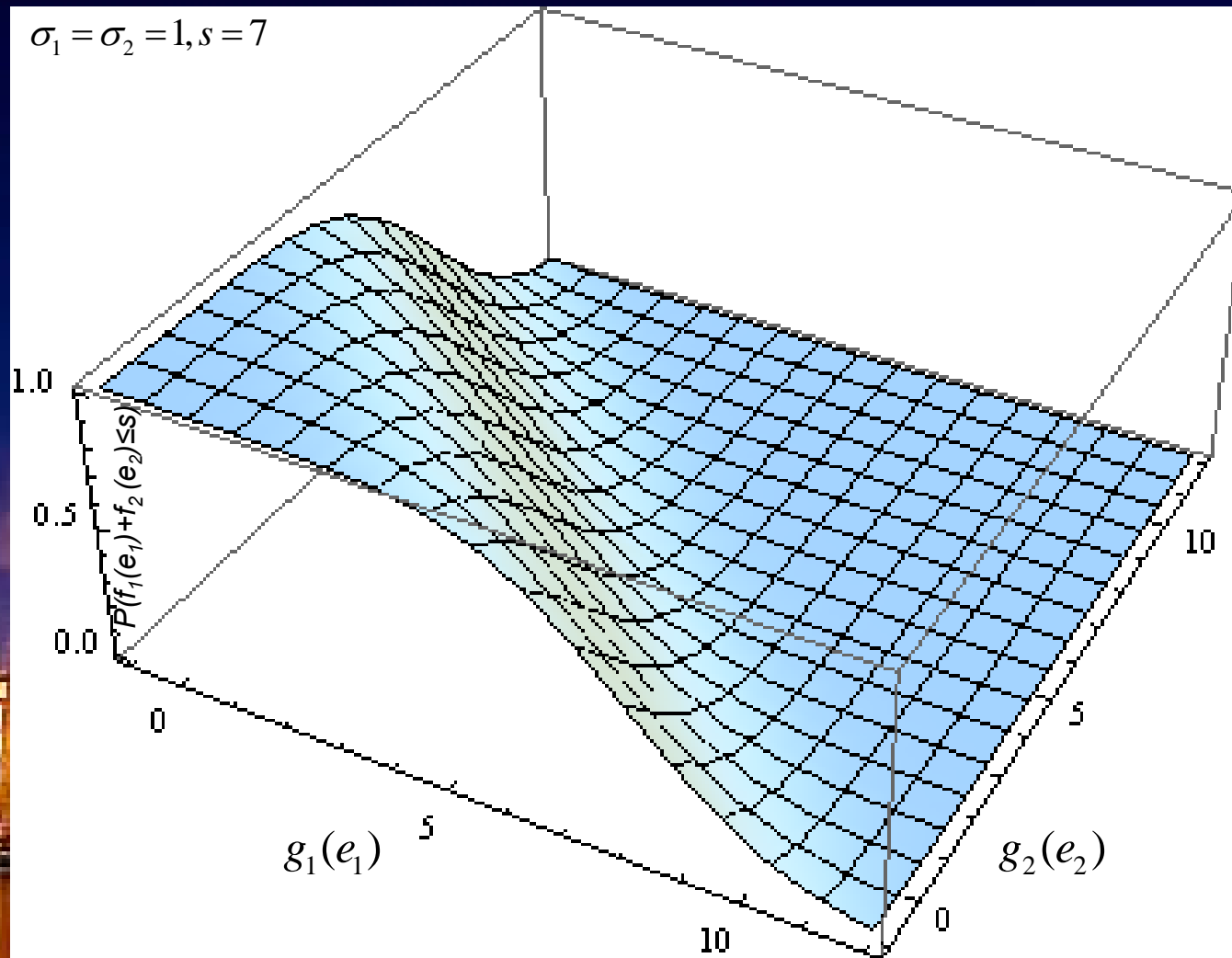
$$\text{s.t. } P(f_1(e_1) + f_2(e_2) \leq \bar{s}) \geq 0.95$$

$$\text{where } f_1(e_1) = g_1(e_1) + \varepsilon_1$$

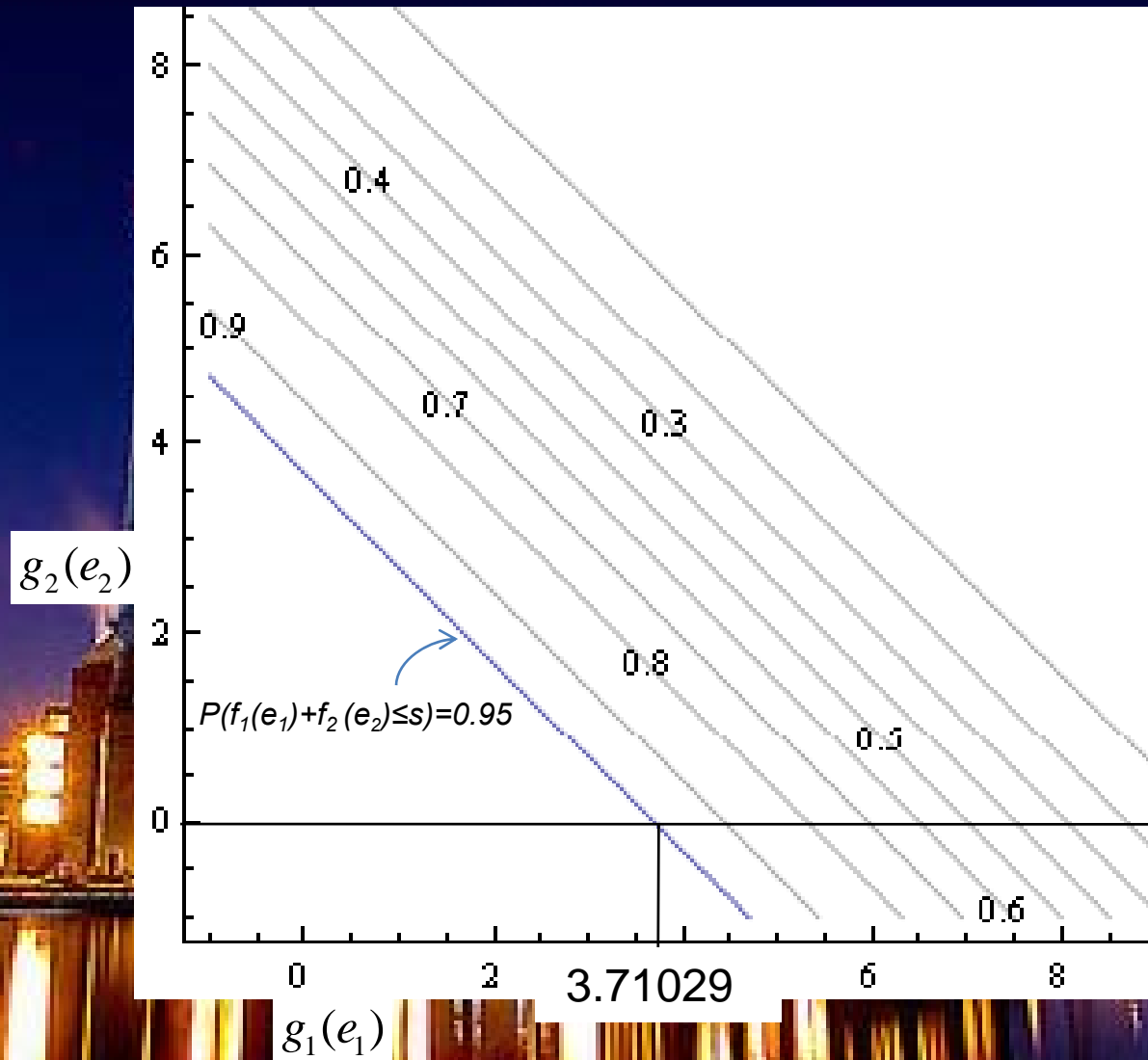
$$f_2(e_2) = g_2(e_2) + \varepsilon_2$$

$$g_1' < 0, g_1'' > 0, g_2' < 0, g_2'' > 0 \quad \begin{pmatrix} \varepsilon_1 \\ \varepsilon_2 \end{pmatrix} \sim \left( \begin{pmatrix} 0 \\ 0 \end{pmatrix}, \begin{pmatrix} \sigma_1^2 & 0 \\ 0 & \sigma_2^2 \end{pmatrix} \right)$$

# Results from the Static Model



# Results from the Static Model



$\sigma_1 = \sigma_2 = 1, s = 7$

# Results from the Static Model

Constraint:

$$P(f_1(e_1) + f_2(e_2) \leq \bar{s}) \geq 0.95$$

$$g_1(e_1) + g_2(e_2) \leq \bar{s} - 1.644(\sigma_{11} + \sigma_{22})$$

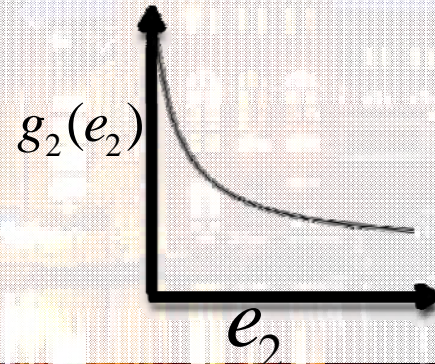
First Order Condition:

$$g_1'(e_1) = g_2'(e_2)$$

# Value of Information?

If  $g_1(x) = g_2(x)$  then the value of reducing either of the variance terms is:

$$\frac{\partial V(\sigma_{11}, \sigma_{22})}{\partial \sigma_i} = -0.822 \frac{\partial}{\partial \sigma_i} g^{-1} \left( \frac{\bar{s} - 1.644(\sigma_{11} + \sigma_{22})}{2} \right)$$



# More Complex Models

- Explicitly model processes
  - Dynamic processes
  - Transportation demand
  - Air pollution chemistry
    - Lots of non-linear responses
  - Transport
  - Effort Process?



# Nordhaus PRICE model

$$\underset{c(t,s)}{\text{Max}} \quad V = \sum_{t=0}^T \frac{p(s) U[c(t,s), P(t,s), s]}{[1 + \rho(s)]^t}$$

subject to

$$Q=f(K,L|A)$$

How production is impacted  
by climate change

C=Y-investment

Emissions=f(control, Q)

CO2 in atmosphere

Functions describing temperature  
and atmospheric chemistry stuff

How damages accrue

# Kaplan, Howitt, Farzin 2003

- Budget constrained resource manager.
- Manages sedimentation from multiple sources under uncertainty
- Can allocate resources to abatement or learning about the different damage coefficients from the pollution sources
- How to back out value of information from this?

# Questions?



# Value Function

$$V(\sigma_{11}, \sigma_{22}) = g^{-1}\left(\frac{\bar{s} - 1.644(\sigma_{11} + \sigma_{22})}{2}\right)$$