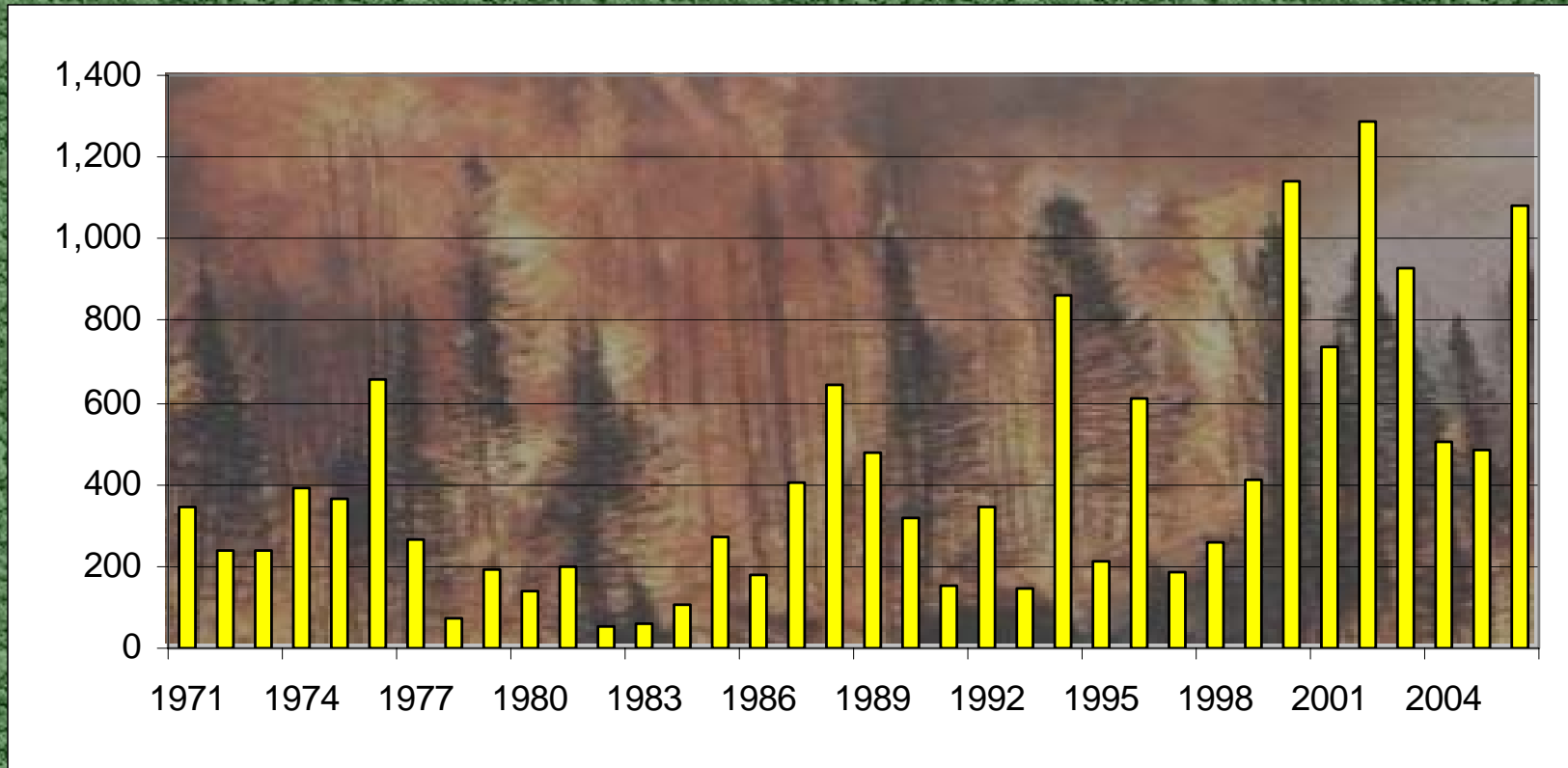


spatial factors influencing  
large wildland **fire** expenditures

**JINGJING LIANG**

forestry sciences lab  
rocky mountain research station  
u.s. department of agriculture

# soaring fire suppression expenditures



Forest Service annual expenditures in 2006 million \$

# findings from previous studies

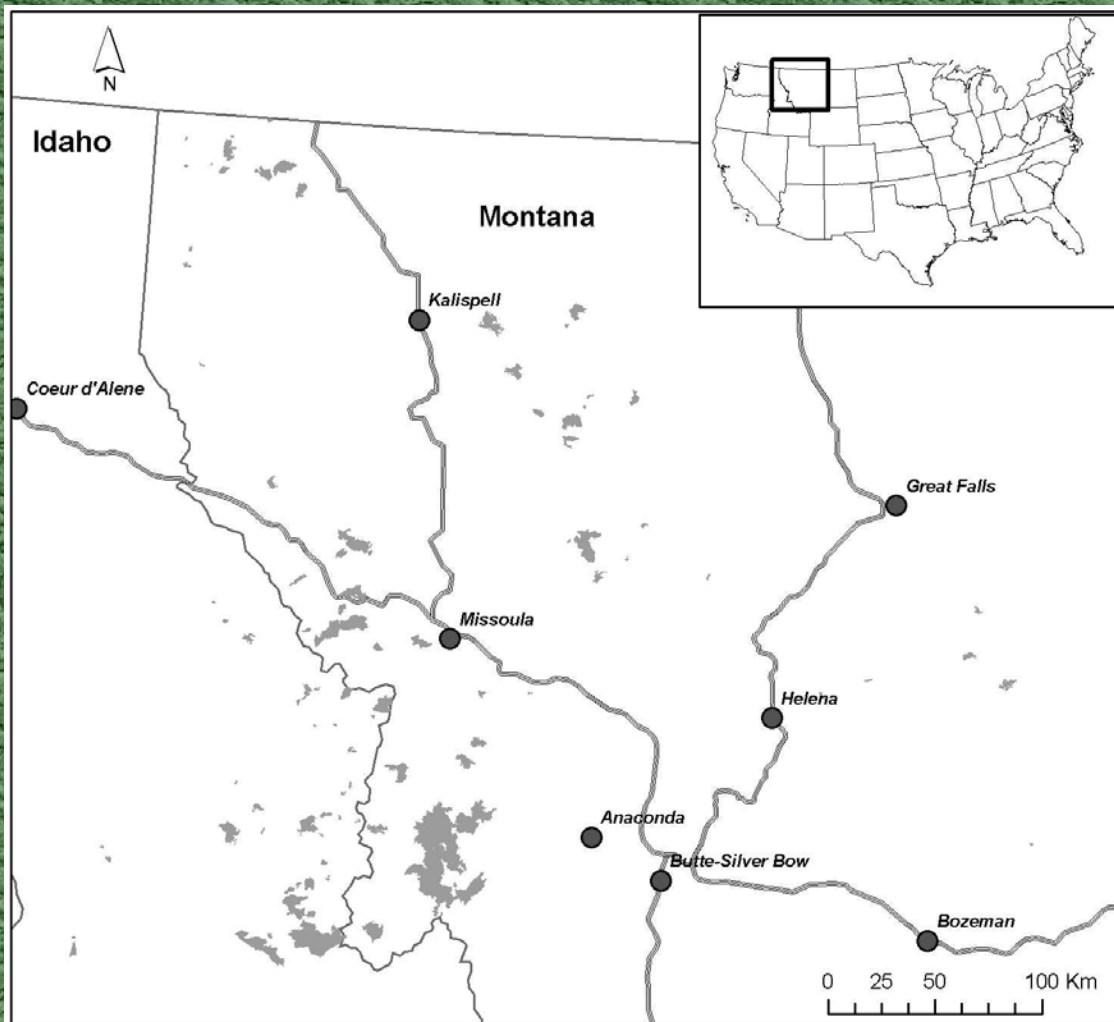
- **fire size increases suppression expenditures**  
(Gonzalez-Caban 1983; Steele and Stier 1998; Donovan *et al.* 2004; Gebert *et al.* 2007)
- **terrain conditions affect suppression expenditures**  
(Donovan *et al.* 2004)
- **home values affect suppression expenditures**  
(Gebert *et al.* 2007)



# objectives

- **test previous findings with spatial explicit fire records**
- **locate factors influencing suppression expenditures from:**
  - fire size and shape**
  - properties values threatened**
  - geographic settings**
  - forest and fuel conditions**
- **construct a model to predict suppression expenditures**

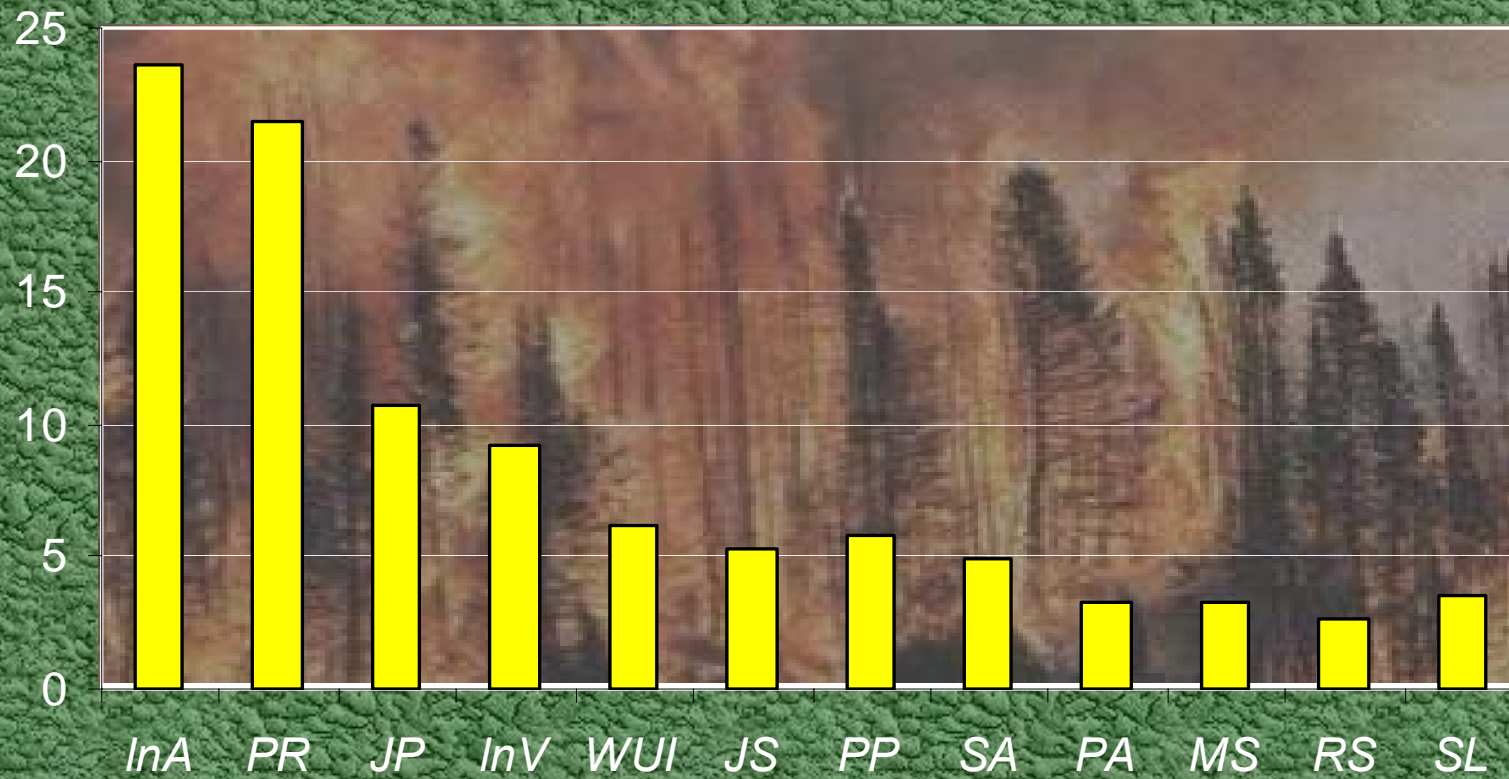
# data



- 100 wildfires
- suppressed by the Forest Service
- greater than 300 acres in size

Variable	Description	Unit	Mean	Std (n=100)
<i>lnC</i>	Suppression expenditure in 2005 dollars	<i>ln</i> (\\$)	13.00	(2.38)
<b>Fire size and shape</b>				
<i>lnA</i>	Total area within fire perimeter	<i>ln</i> (ha)	6.83	(1.37)
<i>PR</i>	Perimeter to area ratio	10 <sup>-3</sup> m <sup>-1</sup>	2.35	(1.37)
<b>Private properties</b>				
<i>JP</i>	Percentage of private land within burned area	%	10.07	(14.17)
<i>lnV</i>	Total structure value (2005\\$) within an eight-kilometer-buffer surrounding the fire perimeter	<i>ln</i> (\\$)	11.51	(6.28)
<i>WUI</i>	Percentage of the wildland-urban interface area within an eight-kilometer-buffer surrounding the fire perimeter, with positive housing density	%	5.84	(8.21)
<b>Public land attributes</b>				
<i>JS</i>	Percentage of state land within burned area	%	0.94	(2.11)
<i>PP</i>	Percentage of public priority areas within burned area	%	0.23	(0.37)
<b>Forest and fuel conditions</b>				
<i>SA</i>	Surface-area-to-volume	10 <sup>3</sup> m <sup>-1</sup>	4.84	(0.37)
<i>PA</i>	Packing ratio		1.53	(0.40)
<i>MS</i>	Moisture content	%	22.97	(1.46)
<i>RS</i>	Rate of spread	m·h <sup>-1</sup>	241.00	(73.13)
<i>FL</i>	Flame length	m	1.28	(0.15)
<i>FF</i>	Fine fuel load	ton·ha <sup>-1</sup>	7.99	(2.77)
<b>Geographic settings</b>				
<i>SL</i>	The percentage of burned area that is less than 35 percent slope	%	52.43	(25.29)
<i>AS</i>	The percentage of burned area with a northern aspect ( $\pm 45^\circ$ from north)	%	22.75	(14.64)
<i>EL</i>	Average elevation of burn area	10 <sup>3</sup> m	1.69	(3.39)
<b>Fire central point</b>				
<i>x</i>	Easting of UTM coordinates	10 <sup>4</sup> m	0.56	(0.15)
<i>y</i>	Northing of UTM coordinates	10 <sup>4</sup> m	5.19	(0.11)

# the most prominent factors



Contribution of explanatory variables to the goodness-of-fit of suppression expenditures

# does size matter?

$$y = 6.10^{**} + 1.01^{**} \cdot \ln A$$

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F	P	R <sup>2</sup>	DW
50.03	0.00	0.33	1.16

---



so size matters, how about shape?

$$y = 9.53^{**} + 0.66^* \cdot \ln A - 0.43 \cdot PR$$

---

F	P	R <sup>2</sup>	DW
26.88	0.00	0.34	1.14

---

# does private properties matter?

$$y = 5.46^{**} + 0.95^{**} \cdot \ln A + 0.06^{**} \cdot JP + 0.04 \cdot \ln V$$

---

F

P

R<sup>2</sup>

DW

---

32.14

0.00

0.49

1.41

---

# any other factors?

$$y = \delta_0 + \delta_1 \ln A + \delta_2 JP + \delta_3 Wui + \delta_4 JS + \delta_5 PP + \delta_6 SA + \delta_7 PA + \delta_8 MS + \delta_9 RS + \delta_{10} FL + \delta_{11} FF + \delta_{12} SL + \delta_{13} AS + \delta_{14} EL + e$$

$$P[H_0: \delta_3 = \delta_4 = \dots = \delta_{14} = 0 \mid \delta_1, \delta_2] = 0.29$$

conclusion: only size and percentage of private land matter.

# predicting suppression expenditures

$$y = 5.48^{**} + 0.92^{**} \cdot \ln A + 0.36^{**} \cdot JP - 0.01^{**} \cdot JP^2 + 0.001^{**} \cdot JP^3$$

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F	P	R <sup>2</sup>	DW
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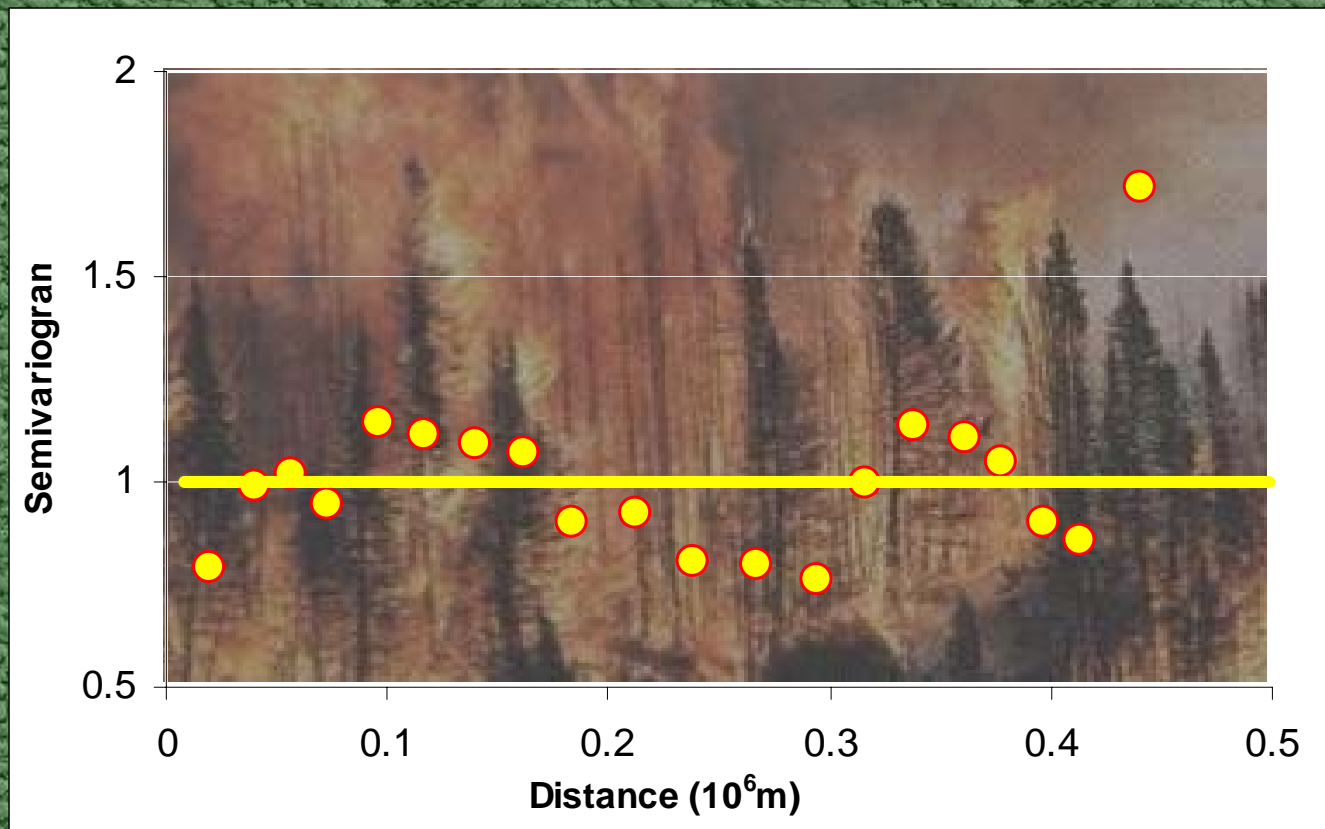
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34.54	0.00	0.58	1.72
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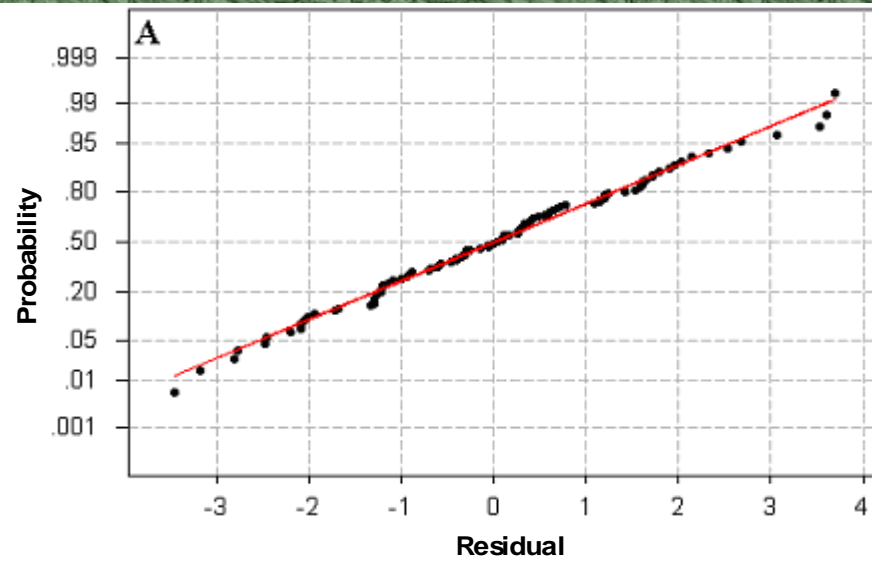
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# residuals: spatial autocorrelation

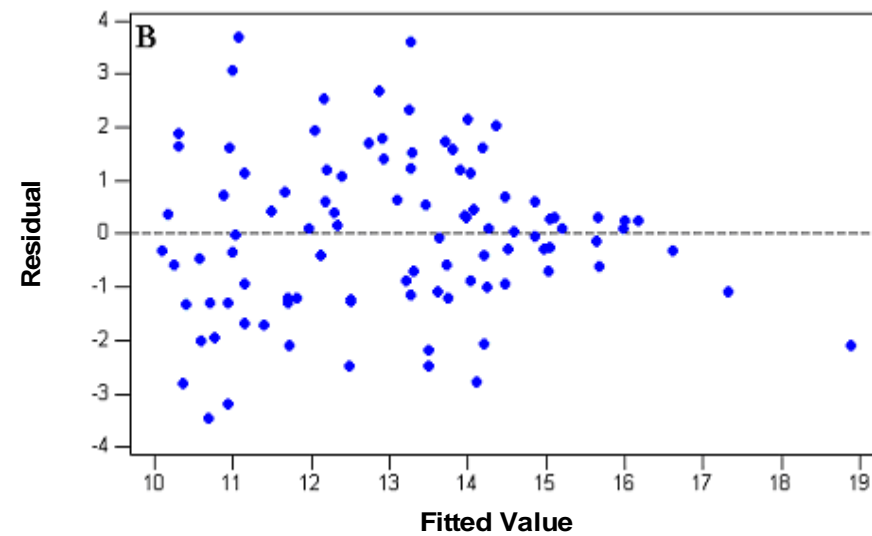
$$y = \eta_0 + \eta_1 \ln A + \eta_2 JP + \eta_3 JP^2 + \eta_4 JP^3 + e(x,y)$$



# residuals: normality



$A^2=0.24, P=0.76$

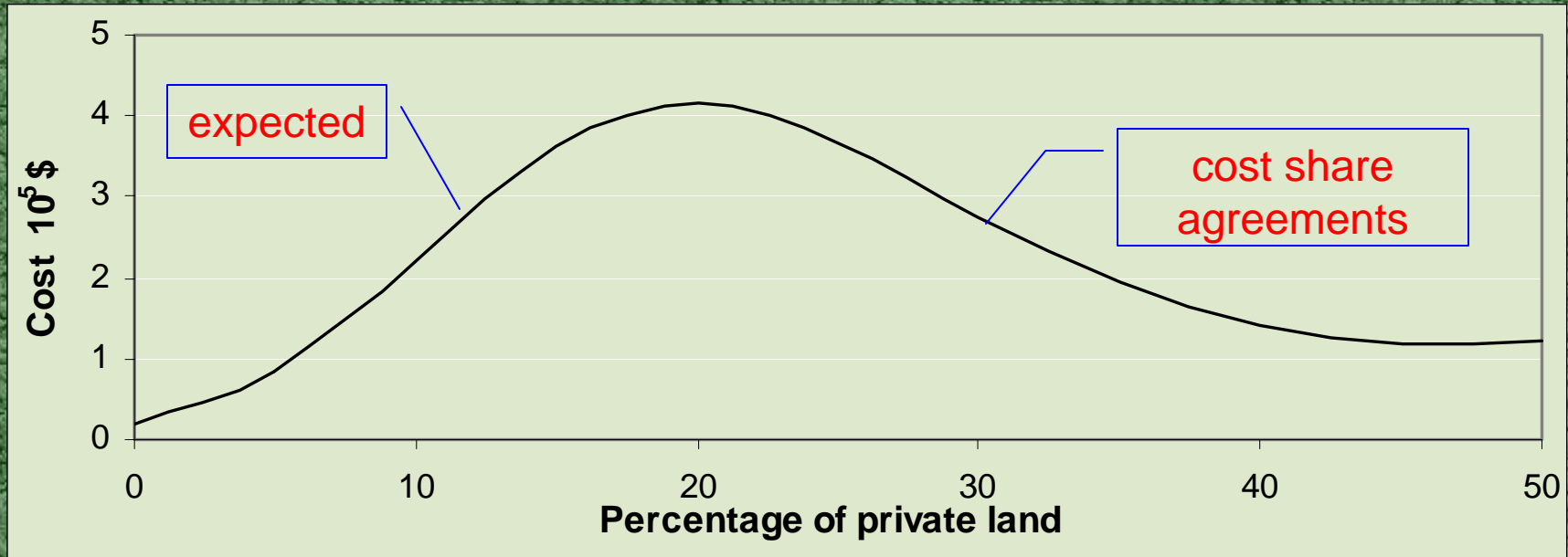


# sensitivity analysis- fire size



$$y = 5.48 + 0.92 \cdot \ln A + 0.36 \cdot JP - 0.01 \cdot JP^2 + 0.001 \cdot JP^3$$

# sensitivity analysis- private land



$$y = 5.48 + 0.92 \cdot \ln A + 0.36 \cdot JP - 0.01 \cdot JP^2 + 0.001 \cdot JP^3$$



# discussion

- prioritization of private property protection had significantly increased wildfire suppression costs
- natural resources had not been given equal consideration
- The role and responsibilities of all levels of government and private parties must be thoughtfully considered in fighting wildfires within populated interface areas.

# epilogue

- spurious correlation is avoided by carrying rigorous statistical tests.
- spatial factors explained 58% of variation in suppression expenditures.
- managerial factors might help to improve the model.