#### Risks in networked world

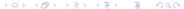
Galina Schwartz\*

\*UC Berkeley

# Moral Hazard (Cyber)-Insurance under asymmetric information







# Problem: designing next gen diesel engine: High performance & efficiency but Low $NO_X$ emissions

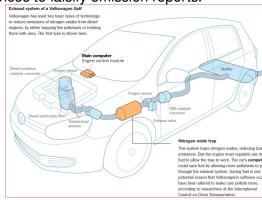
ASYMMETRIC INFORMATION [MH]

#### VW Engineers: Ingenious Technical Solution?

To pass standard emission tests, VW (engineers) employed software-based illegal defeat devices to falsify emission reports.

- 2008 "Next-gen turbo diesel special for N. America"; deception begins
- 2011 Exhaust sys modified; deception intensifies
- US: 0.5mln cars
- Worldwide: 11 mln total: 2.1 mln Audi

Source: Wikipedia: VW emissions scandal & refs. therein



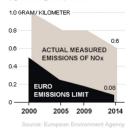
4 D > 4 A > 4 B > 4 B >

# WV scandal from P&A perspective I

#### The gap between ex ante (required) and ex post (real)

## THE GAP BETWEEN RULES AND REALITY

NOx emissions have been dropping in Europe. But the difference between the legal limits (dark shading) — which auto companies comply with in their lab tests — and the actual on-road emissions (light shading) has persisted.



#### Nested P&A settings

- P1 = R (EPA, CARB)
- A1 = VW (hidden info)
  - P2 = VW (top) management
  - As = VW engineers (from separate divisions):
    - engine electronics
      - diesel motor development
    - motor testing

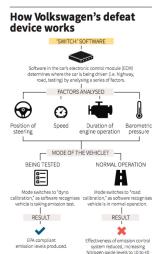




# Problem: VW reputation and stock in free fall I

#### Deceit uncovered: VW Engineers: The fallout

- Lab test USA: standard duration = 1,370 sec.
  - Emission tests require platforms [chassis dynamometers (dynos)]
- 2014. Lab & road tests discrepancies >
  - West Virginia Univ. Report, ICCT grant (2013)
- Full speed ahead: ICCT + CARB
  - ICCT=International Council on Clean Transportation, CARB= CA Air Resources Board
- 2015 July EPA request for explanations. VW engineers admit deception
  - After denials, admit installing software that triggers
  - a "second calibration intended to run only during certification testing."



Source: U.S. Environmental Protection Agency J. Wang, 22/09/2015

4 D > 4 A > 4 B > 4 B

REUTERS

times above standards

# Unraveling: (ICCT) [non-profit] & (CARB) [regulator] I

Software calibrated to emit legally for 1,370 sec. At 1,371st sec. the software switches settings & the car emits nine times the permitted amount of NOx.

- VW engineers view deception as a stopgap measure
- Did they (?)





A worker tests a red 2016 Volkswagen AG Golf TDI emissions certification vehicle inside the California Air Resources Board Haagen-Smit Laboratory in El Monte, California Photo: Bloomberg

# 2015 - 2016 Grand unraveling: VW statements

- Software manipulation (starting Nov. 2006) in 3 departments:
- engine electronics
- diesel motor development
- motor testing



- Reason: "VW employees realized they could not meet emissions rules legally within the time and budget allotted." allotted by whom!?
- Heads of brand development (top execs) suspended:
  - Core VW, Audi (+ VW group tech development),
     Porsche (+ VW engine & transmissions development)
- 11mnl vehicles; \$7.3 bln earmarked
- 2016 Internal inquiry: 17 suspects (up from 6)



# Outside of VW: Friends in high places I

#### VW importance for German economy

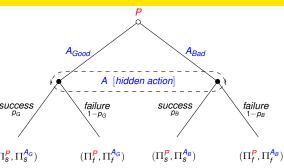
- 2010 "The strict nitrogen oxide limits in CA are damaging German carmakers," ★ (lobbyist) Chancellor Merkel to CARB Chief
- 2015 Extraordinary EU leaders summit on VW crisis (German govt was aware for months)



- VW financial services one of the largest EU banks
- VW scandal Reurters, 10-23-2015
   bigger threat to Germany
   (& EU?) than Greek debt crisis

# Myerson [2008] Game 1 Moral Hazard Extensive form game with hidden action: *P&A*

capital Κ R revenue success prob. if A<sub>G</sub>  $p_G$ success prob. if  $A_B$  $p_{R}$  $p_B$  $< p_G$ success p<sub>G</sub> В A's hidden benefit w A's wage if success Α A's collateral  $(\Pi_{\alpha}^{P}, \Pi_{\alpha}^{A_{G}})$ 



#### Numerical example

K 100 R 240 p<sub>G</sub> 1/2 p<sub>B</sub> 1/4 B 30

$$\Pi^{P} = p_{G}(R - w) + (1 - p_{G})A - K$$

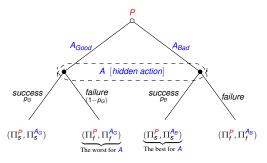
$$\Pi^{A} = \begin{cases} p_{G}w - (1 - p_{G})A & \text{if } A_{G} \\ B + p_{B}w - (1 - p_{B})A & \text{if } A_{B} \end{cases}$$

 $p_BR + B < K < p_GR$ , A < K [makes Game interesting]



# Myerson Game 1: MH with hidden action

■ hidden action: agent chooses  $(A_G \text{ or } A_B)$ 



$$\Pi^{A} = \begin{cases} p_{G}w - (1 - p_{G})A & \text{if } A_{G} \\ B + p_{B}w - (1 - p_{B})A & \text{if } A_{B} \end{cases}$$

Note 1: In equal., A is punished for a failure (w/ prob.  $(1 - p_G)$  or  $(1 - p_B)$ ) Note 2: If  $p_G$  and  $p_B$  are close, and B high – expect problems (violated constraints)

# Myerson Game 1 MH: Solution

A's IC and IR constraints are:

$$p_G w - (1 - p_G)A \ge p_B w - (1 - p_B)A + B$$
 [IC]  
 $p_G w - (1 - p_G)A \ge 0$  [IR]

then, in eq.

$$w^* = w_{IC}^{\min} = \frac{B}{[p_G - p_B]} - A > B \frac{[1 - p_G]}{[p_G - p_B]} = w_{IR}^{\min},$$

A earns positive rent  $\Pi^A > 0$  (in expectation) if

$$\Pi^{A} = \rho_{G} w^{*} - (1 - \rho_{G}) A = \rho_{G} \left\{ \frac{B}{[\rho_{G} - \rho_{B}]} - A \right\} - (1 - \rho_{G}) A$$

$$A < \rho_{G} \frac{B}{[\rho_{G} - \rho_{B}]} \Leftrightarrow \Pi^{A} > 0.$$

# Myerson Game 1 MH: Discussion

#### Numerical example

K 100 R 240  $p_G$  1/2  $p_B$  1/4 R 30

$$A < p_G \frac{B}{[p_G - p_B]} \Leftrightarrow \ \Pi^A > 0$$

If A's assets are below 60, his has rents:  $\Pi^A > 0$ 

P contracts with A only if expects non-negative profit  $\Pi^{P}$ 

$$\Pi^{P} = p_{G}R - \frac{p_{G}B}{[p_{G} - p_{B}]} + A - K = \{p_{G}R - K\} - \left\{\frac{Bp_{G}}{[p_{G} - p_{B}]} - A\right\}$$

$$\Pi^{P} > 0 \Leftrightarrow A > \frac{Bp_G}{[p_G - p_B]} - \{p_GR - K\}$$



# Myerson Game 1 MH: Analysis

Numerical example:  $\Pi^{P} + \Pi^{A} = p_{G}R - K = 240/2 - 100 = 20$ 

$$\Pi^{\textbf{\textit{P}}} \leq 0 \Leftrightarrow \textit{A} \leq \frac{\textit{Bp}_{\textit{G}}}{[\textit{p}_{\textit{G}} - \textit{p}_{\textit{B}}]} - \{\textit{p}_{\textit{G}}\textit{R} - \textit{K}\} \Leftrightarrow \textit{A} \leq 40.$$

With collateral below 40, mechanism fails: project is non-viable:

$$\Pi^{P}=0$$
 and  $\Pi^{A}=0$ , if  $A\in [0,40)$  
$$\Pi^{P}=A-40 \text{ and } \Pi^{A}=60-A, \text{ if } A\in [40,60] \text{ ***}_{\text{[the most realistic]}}$$
 
$$\Pi^{P}=20 \text{ and } \Pi^{A}=0, \text{ if } A\in [60,100)$$

Q: Will A be truthful if A = 65? Or some  $A \in [60, 100]$ ?

A: No: if A could, he will claim A < 60 Hurwitz meets Myerson?



# Modified Myerson Game $\tilde{G}$ (with added randomness)

Game  $G = G(K, R, A, B, p_G, p_B)$  (parameters  $p = \{K, R, A, B, p_G, p_B\}$ )

- Modified game  $\tilde{G} = \tilde{G}(x_K, x_R, x_A, x_B, x_{\rho_G}, x_{\rho_B})$ .
  - $\{K, R, A, B\}$  stat. independent from each other & from  $\{p_G, p_B\}$
  - Drawn by player N (nature) from distr.  $F_p(x)$  with continuous densities  $f_p(x)$  on support(s)  $[x_p^{\min}, x_p^{\max}]$
  - Success prob.  $F_{p_B} \le F_{p_G}$  (first order stat. dominance)
  - **Expected** value of  $x_p$  coincides with the value of p of G:

$$E(x_p) = \int_{x_p^{\min}}^{x_p^{\max}} f_p(x) dx = p, \quad p = \{K, R, A, B, p_G, p_B\}$$

#### **Proposition**

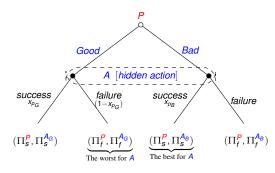
If parameters realized after  ${\it A}$  acts, equilibria of  $\tilde{\it G}$  and  ${\it G}$  coincide.

Proof: In expectation,  $\tilde{G}$  is identical to G (P & A are risk neutral).



# Modified game with hidden action

- hidden action agent <u>chooses</u> (Good or Bad)
- Game G: p<sub>B</sub> < p<sub>G</sub>
- Game  $\tilde{G}$ :  $F_{p_B} \leq F_{p_G}$  [first order stat. dominance]



$$\Pi^{A} = \begin{cases} x_{p_G}w - (1 - x_{p_G})x_A & \text{if Good} \\ x_B + x_{p_B}w - (1 - x_{p_B})x_A & \text{if Bad} \end{cases}$$

$$E(\Pi^{A}) = \begin{cases} p_{G}w - (1 - p_{G})A & \text{if Good} \\ B + p_{B}w - (1 - p_{B})A & \text{if Bad} \end{cases}$$

$$\Pi^{P} + \Pi^{A} = x_{p_G} x_R - x_K$$

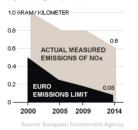
$$E(\Pi^{P} + \Pi^{A}) = p_{G}R - K$$

# WV scandal from P&A perspective: Game 1 or 2?

#### The gap between ex ante (required) and ex post (real)

### THE GAP BETWEEN RULES AND REALITY

NOx emissions have been dropping in Europe. But the difference between the legal limits (dark shading) — which auto companies comply with in their lab tests and the actual on-road emissions (light shading) has persisted.



#### Nested P&A settings

- P1 = R (EPA, CARB)
- A1 = VW (hidden info)
  - P2 = VW (top) management
  - As = VW engineers (from separate divisions):
    - engine electronics
    - diesel motor development
    - motor testing



# Modified game 1: VW emissions test

#### **Timing**

offers emission rules to A  $(p_G, p_B)$ lobbies to soften rules  $(p_G^{VW} > p_G)$ Α accepts emission rules (forced) chooses action  $A_G$  or  $A_R$ draws  $x_p$  from dist. w/ known densities N P & A do not observe relizations payoffs  $\Pi^P$  and  $\Pi^A$ P & A

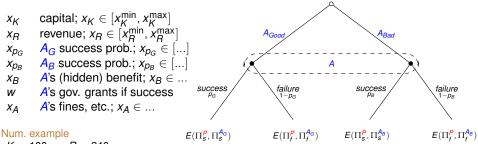
$$E(\Pi^{P} + \Pi^{A}) = p_{G}R - K$$

$$E(\Pi^{A}) = \begin{cases} p_{G}w - (1 - p_{G})A & \text{if } A_{G} \\ B + p_{B}w - (1 - p_{B})A & \text{if } A_{B} \end{cases}$$

#### Modified Game 1: VW emissions scandal

#### WV top management as an agent

■ P1 = R (EPA, CARB) & A1 = VW (hidden info)



$$K = 100$$
  $R = 240$   
 $p_G = 1/2$   $p_B = 1/4$   
 $B = 30$  [high VW profits]

$$E(\Pi^{P}) = p_{G}(R - w) + (1 - p_{G})A - K$$

$$E(\Pi^{A}) = \begin{cases} p_{G}w - (1 - p_{G})A & \text{if } A_{G} \\ B + p_{B}w - (1 - p_{B})A & \text{if } A_{B} \end{cases}$$

### Modified Game 2: VW emissions scandal

#### WV engineers an agents

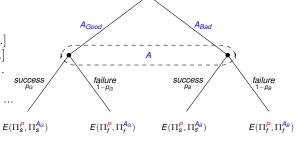
■ P2 = VW (top) & As = VW engineers

$$x_K$$
 capital;  $x_K \in [x_K^{\min}, x_K^{\max}]$  revenue;  $x_R \in [x_R^{\min}, x_R^{\max}]$   $x_{p_G}$   $A_G$  success prob.;  $x_{p_G} \in [...]$   $A_B$  success prob.;  $x_{p_B} \in [...]$   $A$ 's (hidden) benefit;  $x_B \in ...$   $A$  fired, imprisoned(?)  $x_A \in ...$ 

#### Num. example

$$K = 100$$
  $P = 240$   
 $p_G = 1/2$   $p_B = 1/4$   
 $P = 30$  [big bonus?]  
We engineers (different divisions):

- engine electronics
- diesel motor development
- motor testina



$$E(\Pi^{P}) = p_{G}(R - w) + (1 - p_{G})A - K$$

$$E(\Pi^{A}) = \begin{cases} p_{G}w - (1 - p_{G})A & \text{if } A_{G} \\ B + p_{B}w - (1 - p_{B})A & \text{if } A_{B} \end{cases}$$



# VW scandal from P&A perspective Why there were 6 suspects (initially)?



Question: Could (headstrong) VW engineers pull the rigging of US emission tests with no management knowledge?

#### Factors to consider

- 1 A(s) may face enormous punishment, but limited reward
- 2 A(s) deceived repeatedly, for different models & technologies
- 3 A(s) deceived independently (VW & Audi, in several divisions)
- 2016 March. Internal inquiry: 17 suspects (up from 6)

What does the increased number of suspects mean?

## Outside of VW: Expert opinions I

#### Judgement from new auto industry

"VW emissions scandal is mainly the result of physics meeting fiction." *Elon Musk [Tesla Motors CEO]*, Open letter to CARB:



Retrofitting is impractical. Instead, require VW to push a rollout zero emission vehicles.

#### Judgement from traditional auto industry

"I don't think you can do something like this hiding in the bushes." Carlos Ghosn [Renault-Nissan CEO]

I.e., it would be difficult to conceal internally an effort to falsify vehicle emissions data, such as has happened at Volkswagen Group.



#### VW deceit uncovered

#### Top management involvement: the revelations

- 2011 Whistleblower(s?) inform CEO of core VW
- Investigation possibilities: software audit trail & test logs
- 2015 Sept. DoJ order: "stop routine data deletions" IT center whistleblower: deletions continued (explanation "lack of storage space")
- 2016 Jan. DoJ & EPA seek penalties of \$46 bln; + criminal inquiry

Q: Similarities & differences with CPS cyber-security technologies ?

# VW emissions vs CPS security I

#### VW

- software-hardware interact
- public good (environment)
- required level is well defined
- hard to estimate damages
- individual damages are small (in expectation)

#### CPS security

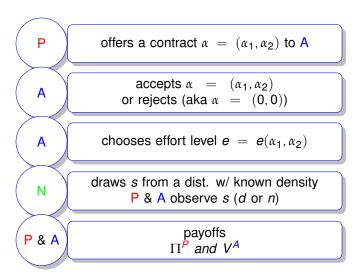
- software-hardware interact
- public good (security)
- required level is poorly defined
- even harder to estimate damages
- information asymmetry is worse for CPS security

# Risk management: perfectly competitive [PC] insurers

```
state s = \{d, n\} (damage or no damage)
S
         prob. of an accident (damage D)
р
W_{\varsigma}
        agent's wealth in state s
D
        damage from an accident
        p'(\cdot) < 0; p''(\cdot) > 0 [new]
p(e)
        A's action (effort to reduce p) [new]
е
U_s
        agent's utility in state s; U'(\cdot) > 0; U''(\cdot) < 0
\Pi_s
         insurer profit in state s
        insurance premium
αı
        coverage (if s = d)
âρ
        contract \alpha = (\alpha_1, \alpha_2)
α
        \alpha_2 = \hat{\alpha}_2 - \alpha_1; \alpha(e) = (\alpha_1(e), \alpha_2(e))
a2
                          \Pi^{P} = (1 - p(e))\alpha_{1} - p(e)\alpha_{2}
         V^{A} = p(e)U(W - \alpha_{1}) + (1 - p(e))U(W - D + \alpha_{2}) - e
```

# Benchmark (no info asymmetry): effort is observable

### **Timing**





# Benchmark (effort is observable): A solution

Contract 
$$\alpha(e) = (\alpha_1(e), \alpha_2(e))$$

$$\Pi^{\mathbf{P}} = \begin{cases} \Pi_n = \alpha_1 & \text{if } s = n \\ \Pi_s = -\alpha_2 & \text{if } s = d \end{cases} V^{\mathbf{A}} = \begin{cases} U_n = U(W - \alpha_1) & \text{if } s = n \\ U_s = U(W - D + \alpha_2) & \text{if } s = d \end{cases}$$

$$\Pi^{\mathbf{P}} = (1 - p(e))\alpha_1 - p\alpha_2$$

$$\textit{V}^{\textit{A}} = \begin{cases} p(e)\textit{U}(\textit{W}) + (1-p(e))\textit{U}(\textit{W}-\textit{D}) - e & \text{if uninsured, } \alpha = (0,0) \\ p(e)\textit{U}(\textit{W}-\alpha_1) - (1-p(e))\textit{U}(\textit{W}-\textit{D}+\alpha_2) - e & \text{if } \alpha = (\alpha_1,\alpha_2) \neq (0,0) \end{cases}$$

Under perfect competition:  $\Pi^{P} = 0$ , for any  $\hat{\alpha}_{2} \in (0, D)$  and any e

$$(1-p(e))/p(e)=\alpha_2/\alpha_1$$
 or  $\alpha_1=p\hat{\alpha}_2$  [actuarially fair contract]

Risk averse agent buys full coverage ( $\hat{\alpha}_2 = D$ ). Same utility in both states (d, n):

$$V^{A} = U(W - p^{*}D) - e$$
 and  $(\alpha_{1}, \alpha_{2}) = (p^{*}D, (1 - p^{*})D); p^{*} = p(e)$ 



# Benchmark (no info asymmetry) PC insurers & agent effort observable I

Agents differ only by the prob. of an accident  $p^i = p(e)$ ;  $\alpha^i = \alpha(e)$  contract for type i = contact for effort e

$$\Pi^{\textbf{\textit{P}}} = \begin{cases} \Pi_{\textbf{\textit{n}}} = \alpha_1(\textbf{\textit{e}}) & \text{if } \textbf{\textit{s}} = \textbf{\textit{n}} \\ \Pi_{\textbf{\textit{s}}} = -\alpha_2(\textbf{\textit{e}}) & \text{if } \textbf{\textit{s}} = \textbf{\textit{d}} \end{cases} \qquad V^{\textbf{\textit{A}}} = \begin{cases} U_{\textbf{\textit{n}}}(\textbf{\textit{W}} - \alpha_1(\textbf{\textit{e}})) - \textbf{\textit{e}} & \text{if } \textbf{\textit{s}} = \textbf{\textit{n}} \\ U_{\textbf{\textit{s}}}(\textbf{\textit{W}} - \textbf{\textit{D}} + \alpha_2(\textbf{\textit{e}})) - \textbf{\textit{e}} & \text{if } \textbf{\textit{s}} = \textbf{\textit{d}} \end{cases}$$

Contract  $\alpha(e)$  for each e

$$(\alpha_1, \alpha_2, e) = (p(e)D, (1 - p(e))D)$$

$$V^{\mathbf{A}}(\mathbf{e}) = U(W - p(\mathbf{e})D) - \mathbf{e}$$

Risk averse agents buy full coverage:  $(\hat{\alpha}_2 = D)$ 

Next: Effort is unobservable [different e = different prob. of an accident p(e)]



# Info asymmetry: PC insurers & hidden agent's effort

Agent type  $i = H, L; p^H > p^L$ .  $\alpha^i$  – contact for i [Rothschild & Stiglitz'76]

$$\Pi^{\textbf{P}} = \begin{cases} \Pi_n = \alpha_1^i & \text{if } s = n \\ \Pi_s = -\alpha_2^i & \text{if } s = d \end{cases} \qquad V^{A^i} = \begin{cases} U_n = U(W - \alpha_1^i) & \text{if } s = n \\ U_s = U(W - D + \alpha_2^i) & \text{if } s = d \end{cases}$$
Agent action  $e$ ;  $\rho(e)$ ;  $\rho' < 0$ ,  $\rho'' > 0$ .  $\alpha(e)$  — contact for  $e$  [Arnott & Stiglitz'91]

$$\Pi^{\mathbf{P}} = \begin{cases} \Pi_{n} = \alpha_{1}(e) & \text{if } s = n \\ \Pi_{s} = -\alpha_{2}(e) & \text{if } s = d \end{cases} \qquad V^{\mathbf{A}} = \begin{cases} U_{n}(W - \alpha_{1}(e)) - e & \text{if } s = n \\ U_{s}(W - D + \alpha_{2}(e)) - e & \text{if } s = d \end{cases}$$

#### Proposition

PC market with MH requires rationing of insurance. [Arnott & Stiglitz'91]

*Intuition:* At any given price, agents want to buy a higher amount of coverage than optimal for insurers.

Arnott & Stiglitz'91: PC insurers with MH

[ideologically similar to Rothschild & Stiglitz'76: PC insurers with AS]

