

Is your software on dope?

Formal analysis of surreptitiously “enhanced” programs

Gilles Barthe, Sebastian Biewer, **Pedro R. D’Argenio**,
Bernd Finkbeiner, and Holger Hermanns

IMDEA Software (ES)

UN Córdoba – CONICET (AR)

Saarland University (DE)

<http://www.cs.famaf.unc.edu.ar/~dargenio/>



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Motivation



You get a third party technically compatible cartridge but ...



- ❖ Refuses to work
- ❖ Shows a warning sign
- ❖ Informs “low toner” earlier than needed

Motivation

Refuses third party
battery and chargers



Refuses or changes
your vote!!!



Motivation

❖ “Chip tuning”:

The electronic control unit (ECU) is reprogrammed to change characteristics (e.g. power, emissions, fuel consumption)



Motivation



Volkswagen emissions scandal

A general characterization

❖ Why characterizations?

A general chara

Clearly not in the
interest of the manufacturer

❖ Why characterizations?

To **formulate** and **enforce** rigid requirements on software **driven by public interest**, so as to effectively ban software doping.

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To **formulate** and **enforce** rigid requirements on software **driven by public interest**, so as to effectively ban software doping.

❖ A software system is **doped** if:

the manufacturer has included a **hidden functionality** in such a way that the resulting behaviour **intentionally favors a designated party**, against the interest of society or of the software licensee.

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Not possible to formalize

E.g. iPhone 6

Doping by discrimination

```
procedure PRINTER(cartridge_info)
```

```
    READ(document)
```

```
    while PAGES_TO_PRINT(document) > 0 do
```

```
        READ(paper_available?)
```

```
        if  $\neg$ paper_available? then
```

```
            TURN_ON(alert_signal)
```

```
            WAIT_UNTIL(paper_available?)
```

```
            TURN_OFF(alert_signal)
```

```
        end if
```

```
        PRINT_NEXT_PAGE(page_out, document)
```

```
    end while
```

```
end procedure
```

Doping by discrimination

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procedure PRINTER(cartridge_info)
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  end while
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end procedure
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parameters

inputs

outputs

Doping by discrimination

A clean program

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    end if
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    PRINTNEXTPAGE(page_out, document)
```

```
  end while
```

```
end procedure
```

parameters

inputs

outputs

Doping by discrimination

```
procedure PRINTER(cartridge_info)
  if BRAND(cartridge_info) = my-brand then
    READ(document)
    while PAGES TOPRINT(document) > 0 do
      READ(paper_available?)
      if  $\neg$ paper_available? then
        TURNON(alert_signal)
        WAITUNTIL(paper_available?)
        TURNOFF(alert_signal)
      end if
      PRINTNEXTPAGE(page_out, document)
    end while
  else
    TURNON(alert_signal)
  end if
end procedure
```

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Doping by discrimination

```
procedure PRINTER(cartridge_info)  
  if BRAND(cartridge_info) = my-brand then  
    READ(document)  
    while PAGES TO PRINT(document) > 0 do  
      READ(paper_available?)  
      if ¬paper_available? then  
        TURN ON(alert_signal)  
        WAIT UNTIL(paper_available?)  
        TURN OFF(alert_signal)  
      end if  
      PRINT NEXT PAGE(page_out, document)  
    end while  
  else  
    TURN ON(alert_signal)  
  end if  
end procedure
```

parameters

inputs

outputs

A doped program

Doping by discrimination

- ❖ A program is **clean** (or **doping-free**) if for every **parameter of interest** it exhibits the same visible outputs when supplied with the same inputs.

Doping by discrimination

- ❖ A program is **clean** (or **doping-free**) if for every **parameter of interest** it exhibits the same visible outputs when supplied with the same inputs.
- ❖ Formally:

$$S : \text{Param} \rightarrow \text{In} \rightarrow 2^{\text{Out}}$$

non-deterministic

S is **clean** (or **doping-free**) if for all

$p, p' \in \text{PIntrst}$ and $i \in \text{In}$, $S(p)(i) = S(p')(i)$

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Defined by a contract

E.g. all compatible cartridges

Doping by discrimination

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procedure PRINTER(cartridge_info)  
  
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  else  
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  end if  
end procedure
```

end procedure



Doping and extended functionality

```
procedure PRINTER(cartridge_info)  
  READ(document)  
  if  $\neg$ NEWTYPE(document)  $\vee$  SUPPORTSNEWTYPE(cartridge_info) then  
    while PAGESTOPRINT(document) > 0 do  
      READ(paper_available?)  
      if  $\neg$ paper_available? then  
        TURNON(alert_signal)  
        WAITUNTIL(paper_available?)  
        TURNOFF(alert_signal)  
      end if  
      PRINTNEXTPAGE(page_out, document)  
    end while  
  else  
    TURNON(alert_signal)  
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end procedure
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Doping and extended quality

The cartridge is standard

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procedure PRINTER(cartridge_info)
  READ(document)
  if  $\neg$ NEWTYPE(document)  $\vee$  SUPPORTSNEWTYPE(cartridge_info) then
    while PAGESTOPRINT(document) > 0 do
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    while PAGESTOPRINT(document) > 0 do  
      READ(paper_available?)  
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        TURNON(alert_signal)  
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      end if  
      PRINTNEXTPAGE(page_out, document)  
    end while  
  else  
    TURNON(alert_signal)  
  end if  
end procedure
```

The input is not



Doping and extended functionality

- ❖ A program is **clean** if for every **parameter of interest** it exhibits the same visible outputs when supplied with any possible **standard input**.
- ❖ Formally

S is **clean** if for all $p, p' \in \text{PIntrst}$
and $i \in \text{In} \cap \text{StdIn}$, $S(p)(i) = S(p')(i)$

Doping and extended functionality

- ❖ A program is **clean** if for every **parameter of interest** it exhibits the same visible outputs when supplied with any possible **standard input**.
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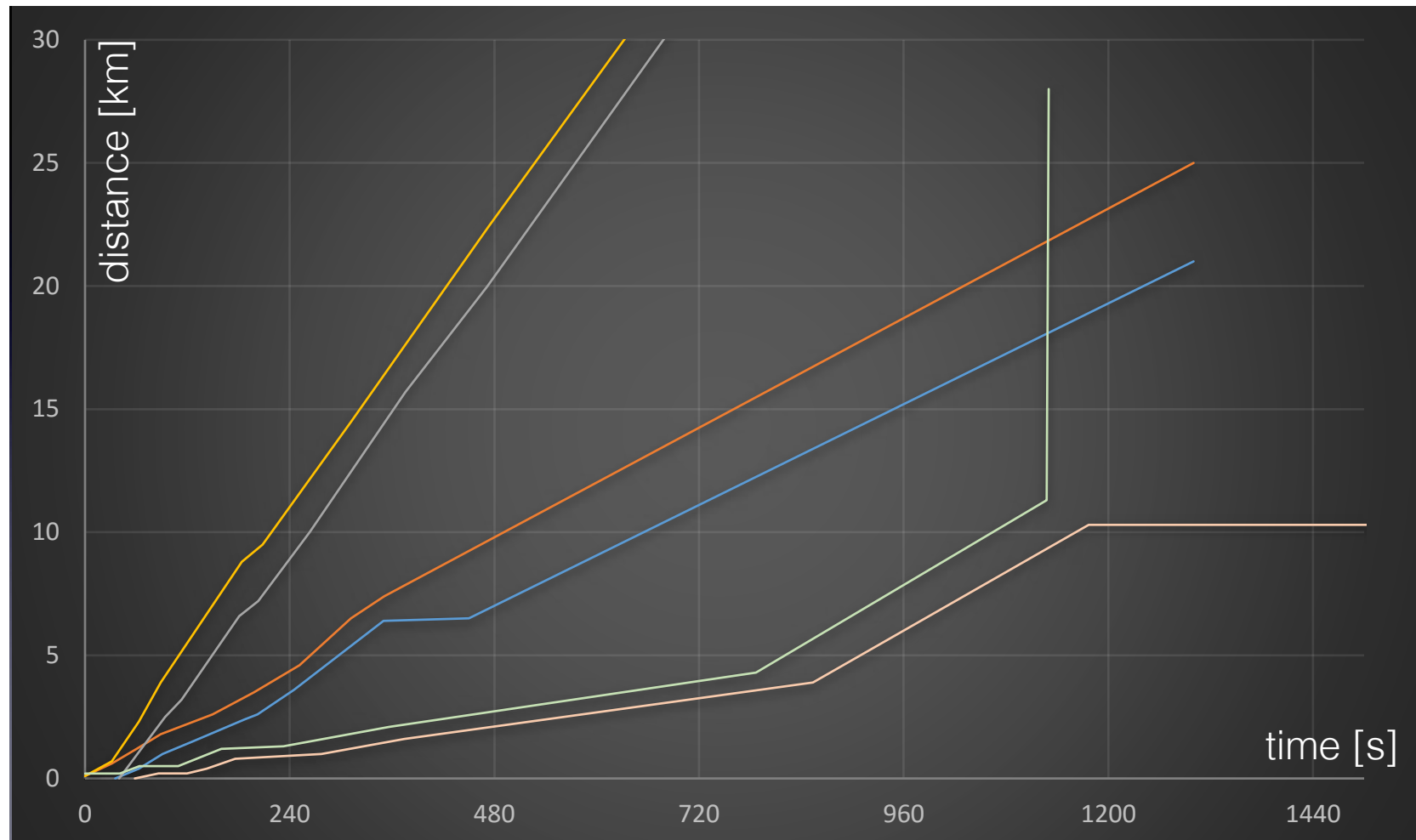
S is **clean** if for all $p, p' \in \text{PIntrst}$
and $i \in \text{In} \cap \text{StdIn}$, $S(p)(i) = S(p')(i)$

Also defined by
a contract

Doping by switching

- ❖ The Volkswagen emissions scandal:
 - ❖ The emission control part of the ECU regulates the emission of NO_x (Mono-nitrogen oxides)
 - ❖ The selective catalytic reduction (SCR) model determines the diesel exhaust fluid (DEF) dosage
 - ❖ Volkswagen used two models
 - ❖ Standard
 - ❖ Alternate

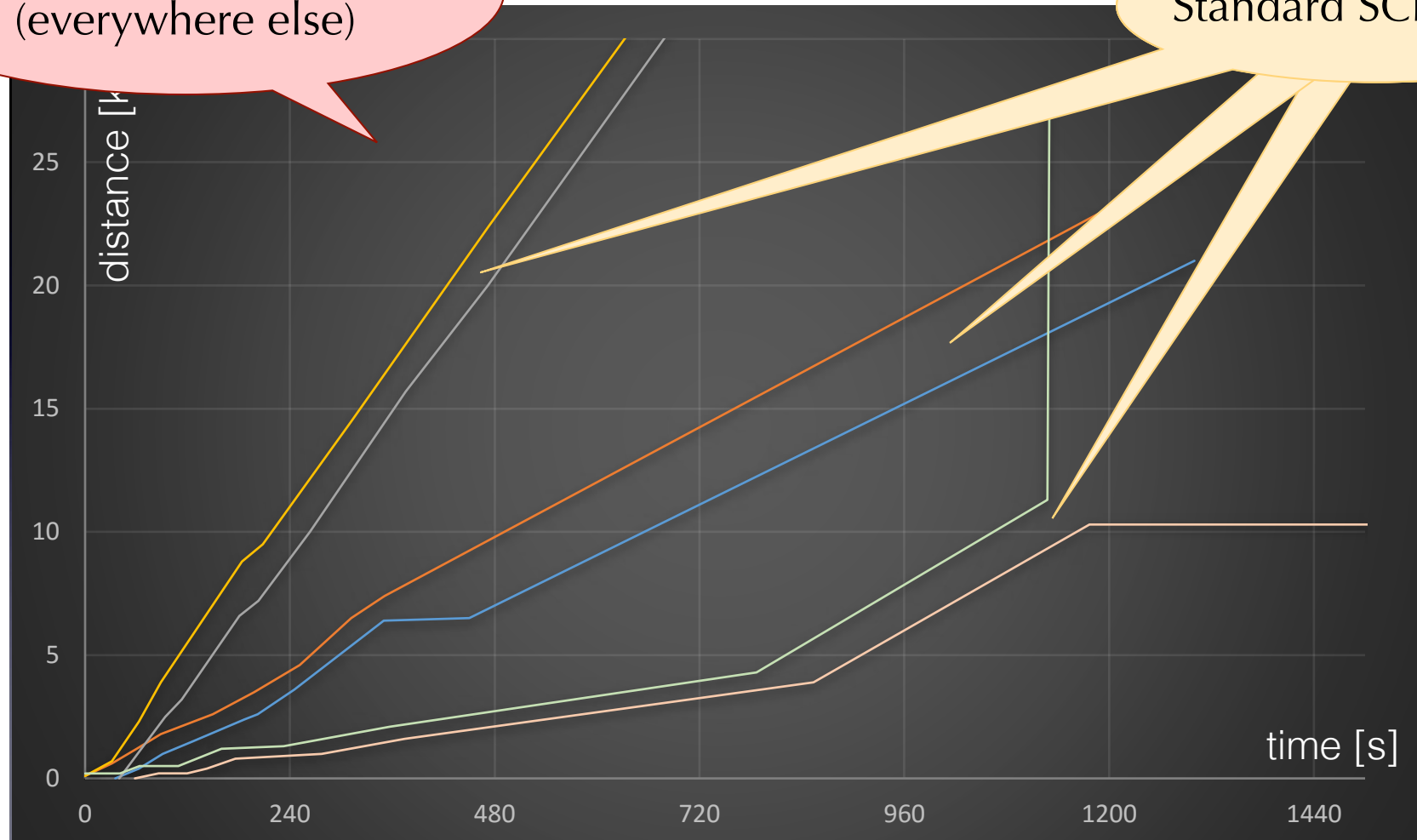
Doping by switching



Doping by switching

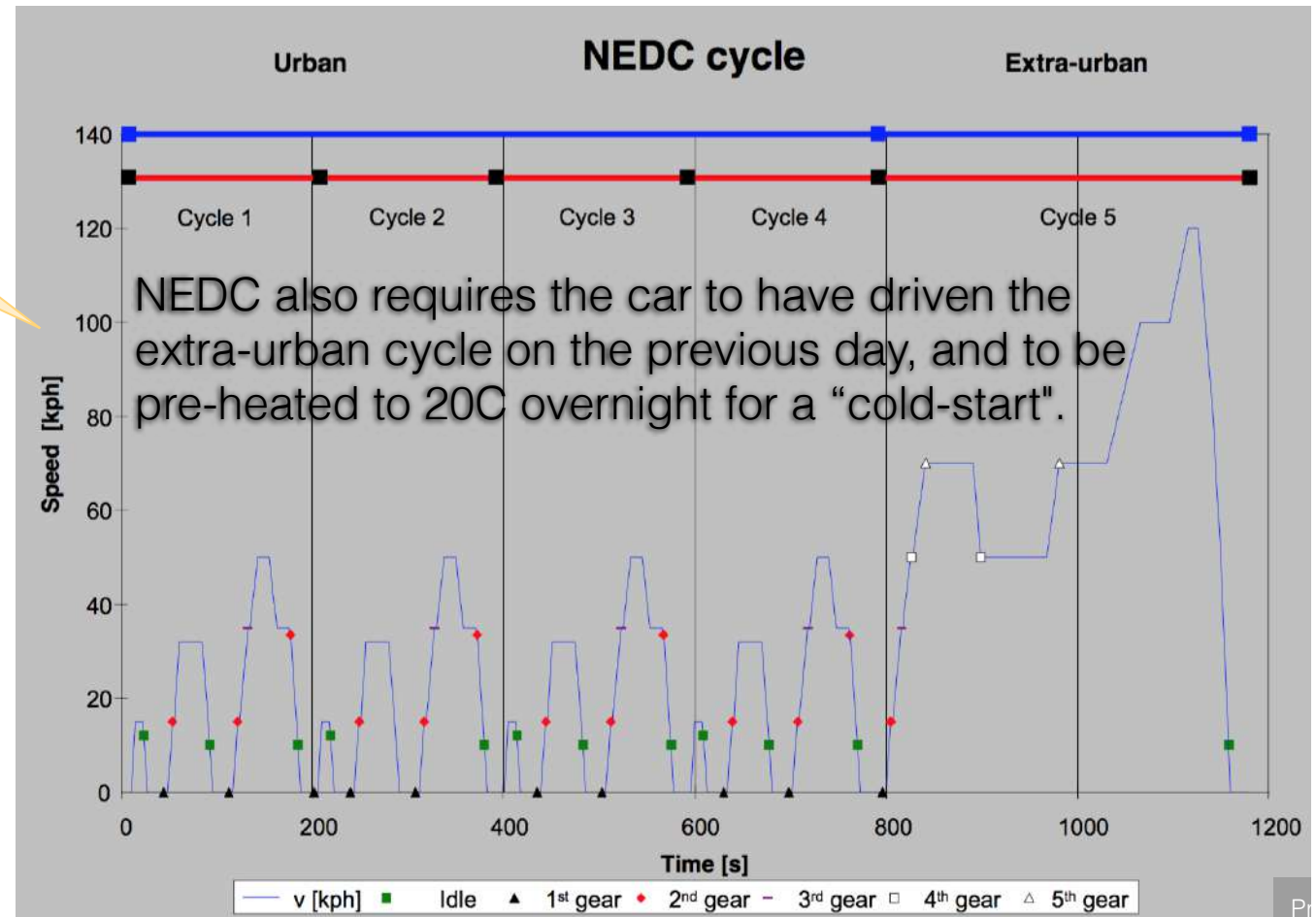
Alternate SCR model
(everywhere else)

Standard SCR model

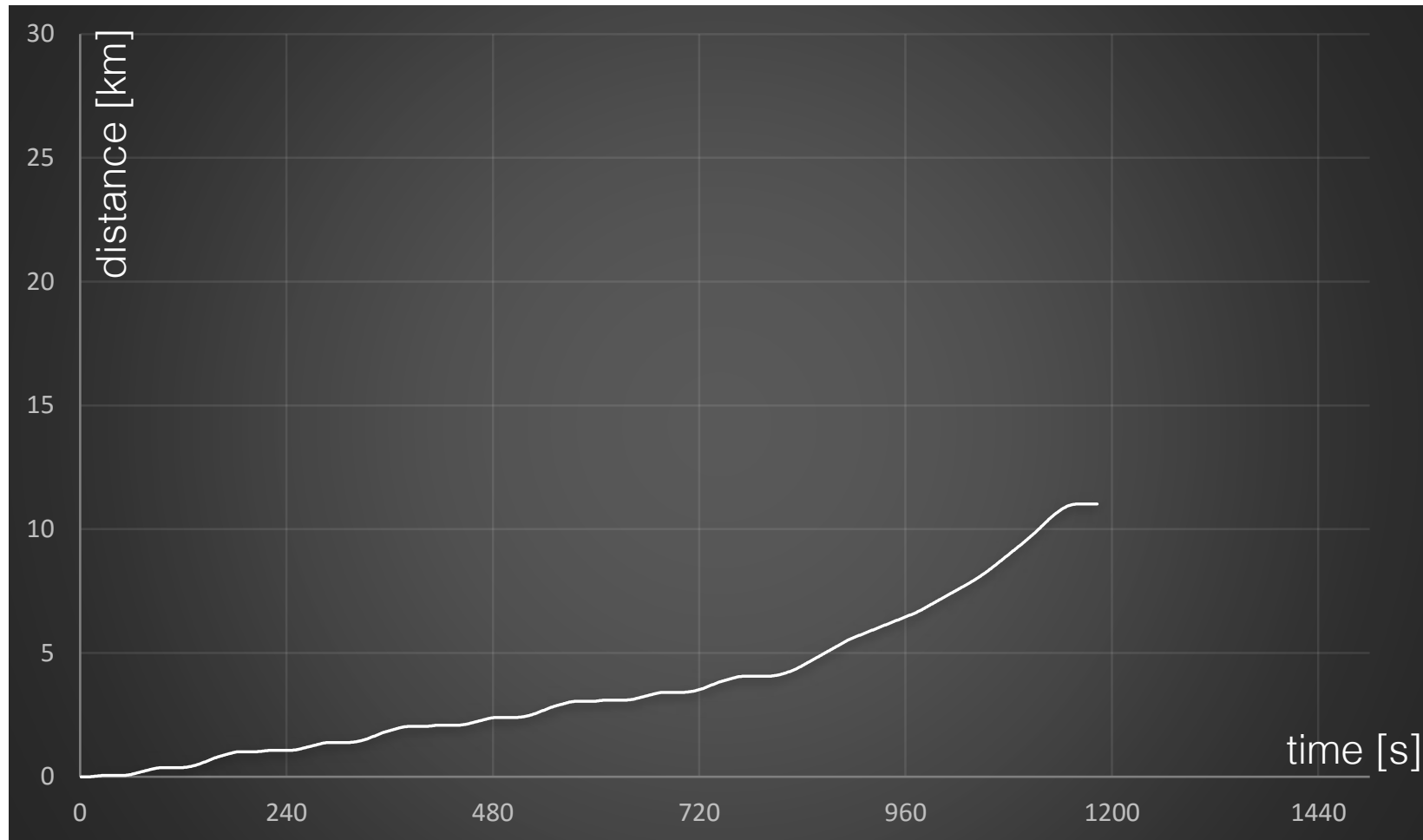


Doping by switching

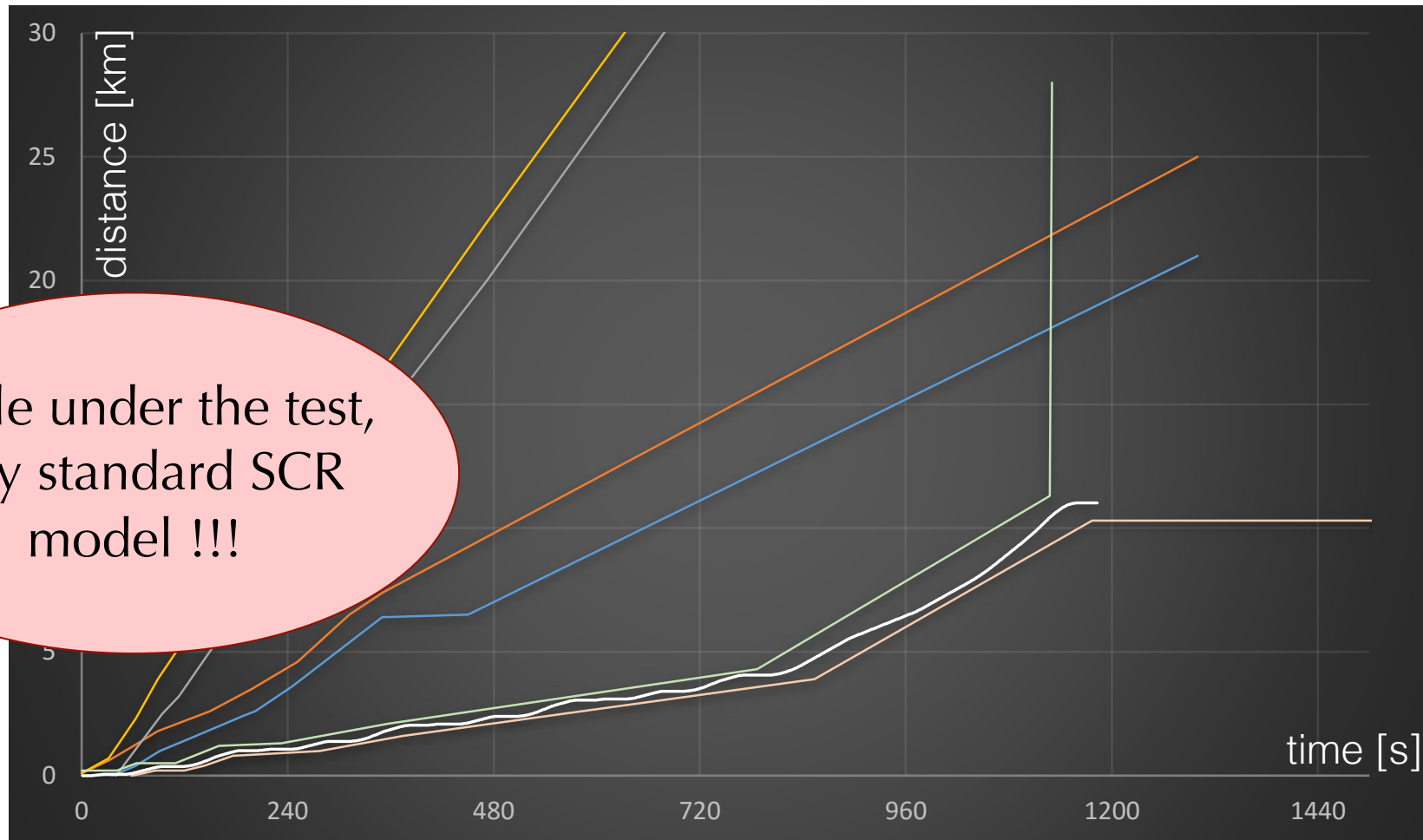
Test for emission verification



Doping by switching



Doping by switching



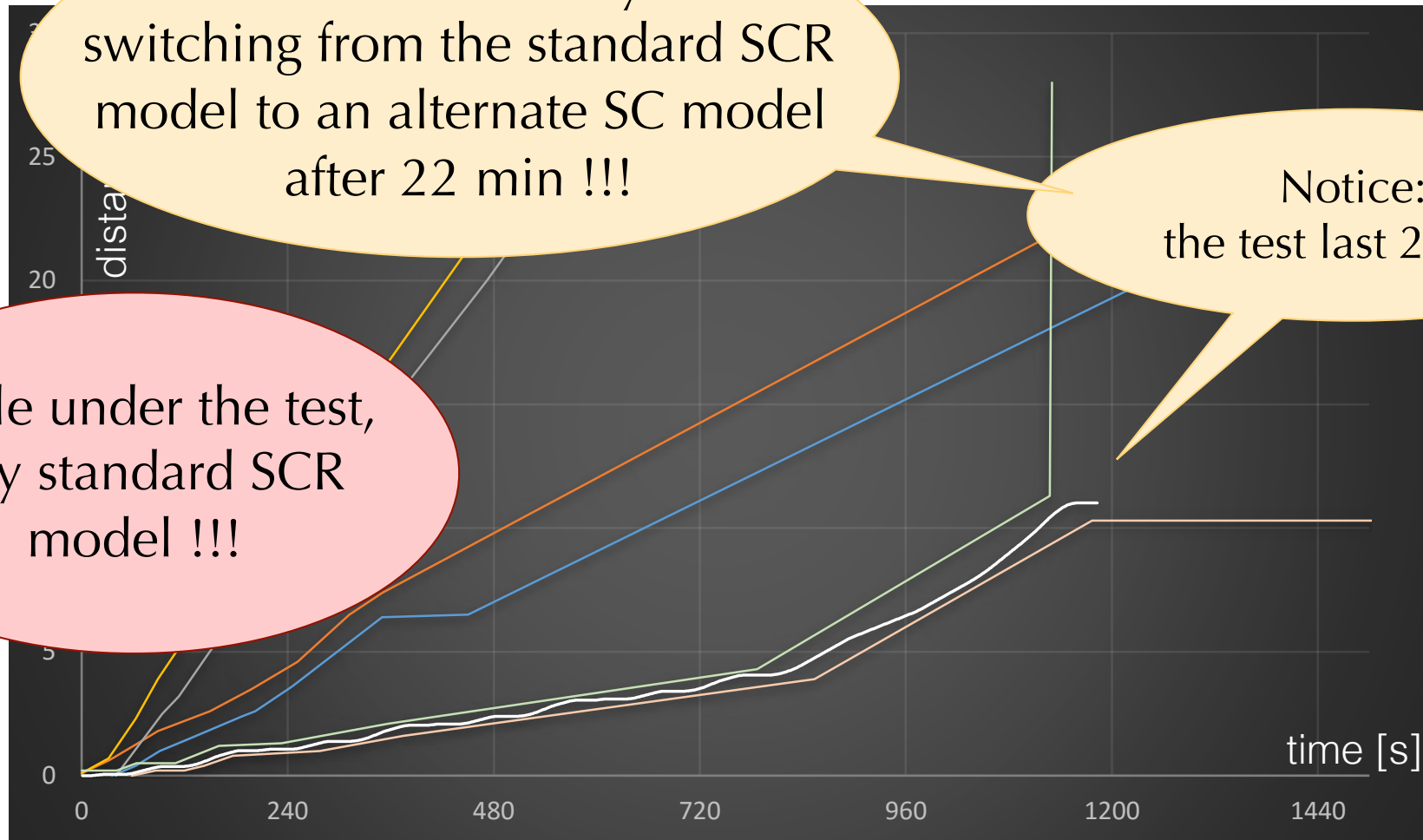
While under the test,
only standard SCR
model !!!

Doping by switching

FIAT cheated by switching from the standard SCR model to an alternate SC model after 22 min !!!

Notice: the test last 20 min

While under the test, only standard SCR model !!!

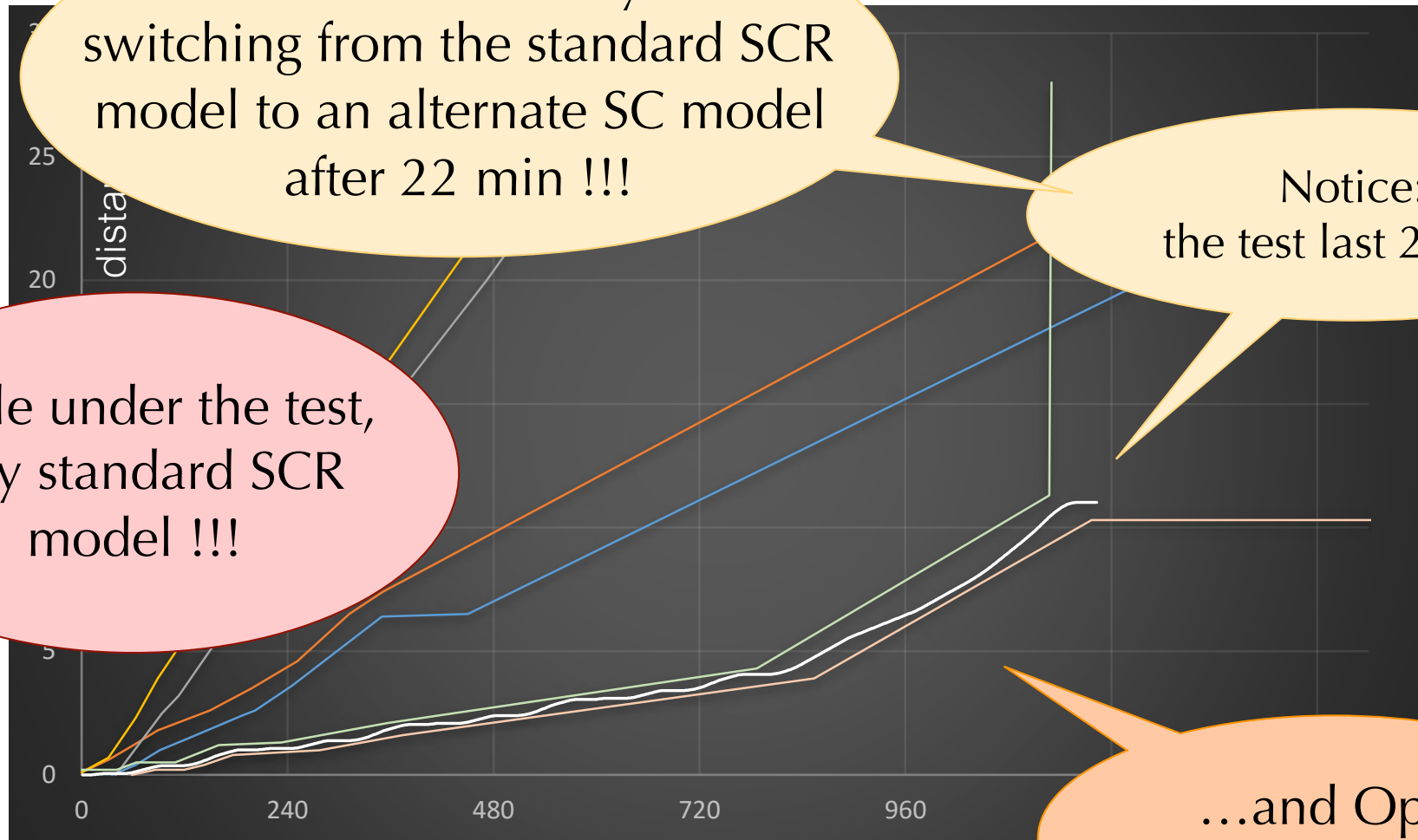


Doping by switching

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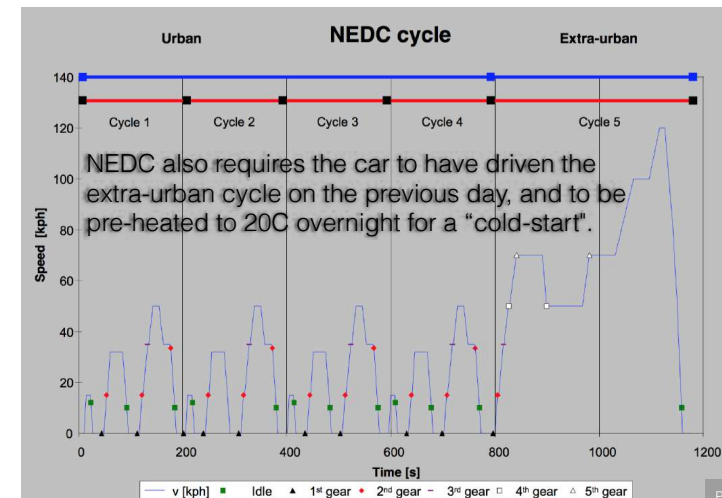
While under the test, only standard SCR model !!!



...and Opel also cheats!!

Doping by switching

- ❖ The **standard inputs** are defined by the **test**
- ❖ The spirit of the emission tests is to verify that the amount of NO_x in the car exhaust gas does not go high **in general**
- ❖ Therefore one expects that:
 - ❖ if the **input values** deviates within a “**reasonable distance**” from the **standard**, the **output values** are also within a “**reasonable distance**” from the **expected output** value produced by the standard input



Doping by switching

❖ Formally

S is *robustly clean* if for all $p, p' \in \text{PIntrst}$ and $i, i' \in \text{In}$, whenever $i \in \text{StdIn}$ and $d_{\text{In}}(i, i') \leq \kappa_i$,

1. for all $o \in S(p)(i)$ there exists $o' \in S(p')(i')$ such that $d_{\text{Out}}(o, o') \leq \kappa_o$, and
2. for all $o' \in S(p')(i')$ there exists $o \in S(p)(i)$ such that $d_{\text{Out}}(o, o') \leq \kappa_o$.

The distances and the thresholds are also defined by the contract

Doping by switching

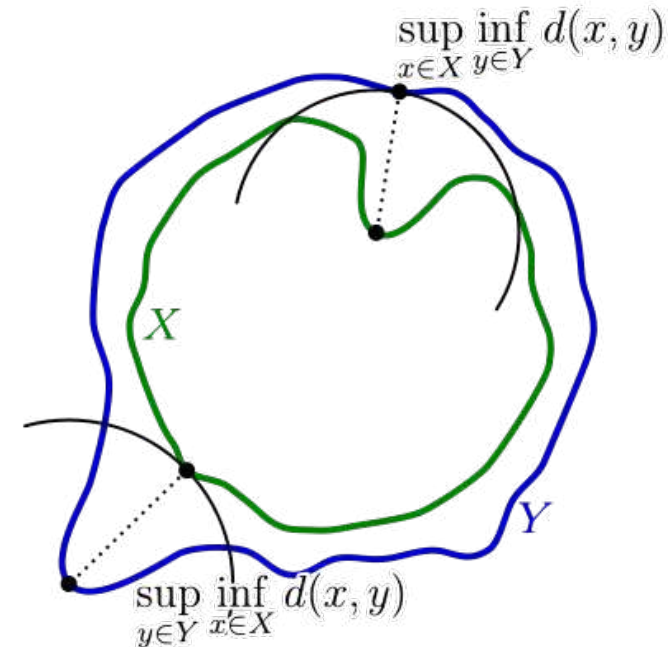
- ❖ Using Hausdorff distance

S is *robustly clean* if for all $p, p' \in \text{PIntrst}$ and $i, i' \in \text{In}$, whenever $i \in \text{StdIn}$ and $d_{\text{In}}(i, i') \leq \kappa_i$, then

$$\mathcal{H}(d_{\text{Out}})(S(p)(i), S(p')(i')) \leq \kappa_o$$

where

$$\mathcal{H}(d)(A, B) = \max \left\{ \begin{array}{l} \sup_{a \in A} \inf_{b \in B} d(a, b), \\ \sup_{b \in B} \inf_{a \in A} d(a, b) \end{array} \right\}$$



Doping by switching

❖ Formally (more general)

S is *f-clean* if for all $p, p' \in \text{PIntrst}$ and $i, i' \in \text{In}$,
whenever $i \in \text{StdIn}$,

1. for all $o \in S(p)(i)$ there exists $o' \in S(p')(i')$
such that $d_{\text{Out}}(o, o') \leq f(d_{\text{In}}(i, i'))$, and
2. for all $o' \in S(p')(i')$ there exists $o \in S(p)(i)$
such that $d_{\text{Out}}(o, o') \leq f(d_{\text{In}}(i, i'))$.

Function f is also
defined by the contract

Doping by switching

- ❖ Using Hausdorff distance

S is *f-clean* if for all $p, p' \in \text{PIntrst}$ and $i, i' \in \text{In}$,
whenever $i \in \text{StdIn}$,

$$\mathcal{H}(d_{\text{Out}})(S(p)(i), S(p')(i')) \leq f(d_{\text{In}}(i, i'))$$

Analysis with Self-Composition

(deterministic programs)

$$\{ \text{Plntrst} \wedge \text{StdIn} \wedge (\text{Plntrst} \wedge \text{StdIn})[\vec{x}/\vec{x}'] \wedge \vec{x}_i = \vec{x}'_i \}$$

$$S ; S[\vec{x}/\vec{x}']$$

$$\{ \vec{x}_o = \vec{x}'_o \}$$

S is *clean* if for all $p, p' \in \text{Plntrst}$
and $i \in \text{In} \cap \text{StdIn}$, $S(p)(i) = S(p')(i)$

Not quite right:
fails if S does not terminate
but $S[x/x']$ does

Analysis with Self-Composition

(deterministic programs)

❖ S is *clean* iff

$$\left(\begin{array}{l} (\text{PIntrst} \wedge \text{StdIn}) \\ \wedge (\text{PIntrst} \wedge \text{StdIn})[\vec{x}/\vec{x}'] \\ \wedge \vec{x}_i = \vec{x}'_i \\ \wedge \text{wp}(S, \text{true}) \end{array} \right) \Rightarrow \text{wp}(S; S[\vec{x}/\vec{x}'], \vec{x}_o = \vec{x}'_o)$$

Analysis with Self-Composition

(deterministic programs)

❖ S is *robustly clean* iff

$$\left(\begin{array}{l} \text{PIntrst} \wedge \text{StdIn} \\ \wedge \text{PIntrst}[\vec{x}/\vec{x}'] \\ \wedge d_i(\vec{x}_i, \vec{x}'_i) \leq \kappa_i \\ \wedge \text{wp}(S, \text{true}) \end{array} \right) \Rightarrow \text{wp}(S; S[\vec{x}/\vec{x}'], d_{\text{Out}}(\vec{x}_o, \vec{x}'_o) \leq \kappa_o)$$

$$\left(\begin{array}{l} \text{PIntrst} \wedge \text{StdIn} \\ \wedge \text{PIntrst}[\vec{x}/\vec{x}'] \\ \wedge d_i(\vec{x}_i, \vec{x}'_i) \leq \kappa_i \\ \wedge \text{wp}(S[\vec{x}/\vec{x}'], \text{true}) \end{array} \right) \Rightarrow \text{wp}(S[\vec{x}/\vec{x}']; S, d_{\text{Out}}(\vec{x}_o, \vec{x}'_o) \leq \kappa_o)$$

Analysis with Self-Composition

(deterministic programs)

❖ S is *f-clean* iff for all Y

$$\left(\begin{array}{l} \text{PIntrst} \wedge \text{StdIn} \\ \wedge \text{PIntrst}[\vec{x}/\vec{x}'] \\ \wedge f(d_i(\vec{x}_i, \vec{x}'_i)) = Y \\ \wedge \text{wp}(S, \text{true}) \end{array} \right) \Rightarrow \text{wp}(S; S[\vec{x}/\vec{x}'], d_{\text{Out}}(\vec{x}_o, \vec{x}'_o) \leq Y)$$

$$\left(\begin{array}{l} \text{PIntrst} \wedge \text{StdIn} \\ \wedge \text{PIntrst}[\vec{x}/\vec{x}'] \\ \wedge f(d_i(\vec{x}_i, \vec{x}'_i)) = Y \\ \wedge \text{wp}(S[\vec{x}/\vec{x}'], \text{true}) \end{array} \right) \Rightarrow \text{wp}(S[\vec{x}/\vec{x}']; S, d_{\text{Out}}(\vec{x}_o, \vec{x}'_o) \leq Y)$$

Reactive Systems

- ❖ A program is interpreted as a function $S : \text{Param} \rightarrow \text{In}^\omega \rightarrow 2^{(\text{Out}^\omega)}$
- ❖ and the set of standard inputs as a language $\text{StdIn} \subseteq \text{In}^\omega$

S is *clean* if for all $p, p' \in \text{PIntrst}$
and $i \in \text{In}^\omega \cap \text{StdIn}$, $S(p)(i) = S(p')(i)$

Reactive Systems

❖ Distances run on *finite* words:

$$d_{\text{In}} : (\text{In}^* \times \text{In}^*) \rightarrow \mathbb{R}_{\geq 0} \quad \text{and} \quad d_{\text{Out}} : (\text{Out}^* \times \text{Out}^*) \rightarrow \mathbb{R}_{\geq 0}$$

S is *robustly clean* if for all $p, p' \in \text{Plntrst}$ and $i, i' \in \text{In}^\omega$,
if $i \in \text{StdIn}$, for all $k \geq 0$,

$$(\forall j \leq k : d_{\text{In}}(i[..j], i'[..j]) \leq \kappa_i)$$

$$\Rightarrow \mathcal{H}(d_{\text{Out}})(S(p)(i)[..k], S(p')(i')[..k]) \leq \kappa_o$$

Reactive Systems

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S is *f-clean* if for all $p, p' \in \text{PIntrst}$ and $i, i' \in \text{In}^\omega$,
if $i \in \text{StdIn}$, for all $k \geq 0$,

$$\mathcal{H}(d_{\text{Out}})(S(p)(i)[..k], S(p')(i')[..k]) \leq f(d_{\text{In}}(i[..k], i')[..k])$$

Analysis with HyperLTL

❖ S is *clean* iff it satisfies

$$\forall \pi_1. \forall \pi_2. \exists \pi'_2. (PIntrs_{\pi_1} \wedge PIntrs_{\pi_2} \wedge StdIn_{\pi_1}) \\ \rightarrow (p_{\pi_2} = p_{\pi'_2} \wedge G(i_{\pi_1} = i_{\pi'_2} \wedge o_{\pi_1} = o_{\pi'_2}))$$

Analysis with HyperLTL

❖ S is *clean* iff it satisfies

Like LTL but adds
quantification on traces

$$\forall \pi_1. \forall \pi_2. \exists \pi'_2. (PIntrs_{\pi_1} \wedge PIntrs_{\pi_2} \wedge StdIn_{\pi_1}) \\ \rightarrow (p_{\pi_2} = p_{\pi'_2} \wedge G(i_{\pi_1} = i_{\pi'_2} \wedge o_{\pi_1} = o_{\pi'_2}))$$

Analysis: LTL

❖ S is *clean* iff it satisfies

PItrs: a propositional formula identifying the parameter of interests

StdIn: an LTL formula identifying the traces with standard input sequences

$$\forall \pi_1. \forall \pi_2. \exists \pi'_2. (PItrs_{\pi_1} \wedge PItrs_{\pi_2} \wedge StdIn_{\pi_1}) \\ \rightarrow (p_{\pi_2} = p_{\pi'_2} \wedge G(i_{\pi_1} = i_{\pi'_2} \wedge o_{\pi_1} = o_{\pi'_2}))$$

$$\bigwedge_{a \in AP_p} a_{\pi_2} \leftrightarrow a_{\pi'_2}$$

$$\bigwedge_{a \in AP_i} a_{\pi_1} \leftrightarrow a_{\pi'_2}$$

$$\bigwedge_{a \in AP_o} a_{\pi_1} \leftrightarrow a_{\pi'_2}$$

Analysis with HyperLTL

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S is *clean* if for all $p, p' \in PIntrst$

and $i \in In^\omega \cap StdIn$, $S(p)(i) = S(p')(i)$

Analysis with HyperLTL

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S is *clean* if for all $p, p' \in PIntrst$
and $i \in In^\omega \cap StdIn$, $S(p)(i) \subseteq S(p')(i)$

Analysis with HyperLTL

❖ S is *robustly clean* iff it satisfies

$$d_{\text{In}}(i, i') = \hat{d}_{\text{In}}(\text{last}(i), \text{last}(i'))$$

$$\forall \pi_1. \forall \pi_2. \exists \pi'_2.$$

$$(\text{PIntrs}_{\pi_1} \wedge \text{PIntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1})$$

$$\rightarrow \left(\mathbf{p}_{\pi_2} = \mathbf{p}_{\pi'_2} \wedge \mathbf{G}(i_{\pi_2} = i_{\pi'_2}) \wedge \left((\hat{d}_{\text{Out}}(\mathbf{o}_{\pi_1}, \mathbf{o}_{\pi'_2}) \leq \kappa_o) \mathbf{W} (\hat{d}_{\text{In}}(i_{\pi_1}, i_{\pi'_2}) > \kappa_i) \right) \right)$$

Analysis with HyperLTL

❖ S is *robustly clean* iff it satisfies

$$\begin{aligned} & \forall \pi_1. \forall \pi_2. \exists \pi'_2. \\ & (\text{PIntrs}_{\pi_1} \wedge \text{PIntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1}) \\ & \rightarrow \left(\mathbf{p}_{\pi_2} = \mathbf{p}_{\pi'_2} \wedge \mathbf{G}(i_{\pi_2} = i_{\pi'_2}) \wedge \left((\hat{d}_{\text{Out}}(\mathbf{o}_{\pi_1}, \mathbf{o}_{\pi'_2}) \leq \kappa_o) \mathbf{W} (\hat{d}_{\text{In}}(i_{\pi_1}, i_{\pi'_2}) > \kappa_i) \right) \right) \end{aligned}$$

S is *robustly clean* if for all $\mathbf{p}, \mathbf{p}' \in \text{PIntrst}$ and $i, i' \in \text{In}^\omega$,
if $i \in \text{StdIn}$, for all $k \geq 0$,

$$(\forall j \leq k : d_{\text{In}}(i[..j], i'[..j]) \leq \kappa_i)$$

$$\Rightarrow \mathcal{H}(d_{\text{Out}})(S(\mathbf{p})(i)[..k], S(\mathbf{p}')(i')[..k]) \leq \kappa_o$$

$$\mathcal{H}(d)(A, B) = \max \left\{ \begin{array}{l} \sup_{a \in A} \inf_{b \in B} d(a, b), \\ \sup_{b \in B} \inf_{a \in A} d(a, b) \end{array} \right\}$$

Analysis with HyperLTL

❖ S is *robustly clean* iff it satisfies

$$\forall \pi_1. \forall \pi_2. \exists \pi'_2.$$

$$(\text{PIntrs}_{\pi_1} \wedge \text{PIntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1})$$

$$\rightarrow \left(\mathbf{p}_{\pi_2} = \mathbf{p}_{\pi'_2} \wedge \mathbf{G}(i_{\pi_2} = i_{\pi'_2}) \wedge \left((\hat{d}_{\text{Out}}(\mathbf{o}_{\pi_1}, \mathbf{o}_{\pi'_2}) \leq \kappa_o) \mathbf{W} (\hat{d}_{\text{In}}(i_{\pi_1}, i_{\pi'_2}) > \kappa_i) \right) \right)$$

$$\forall \pi_1. \forall \pi_2. \exists \pi'_1.$$

$$(\text{PIntrs}_{\pi_1} \wedge \text{PIntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1})$$

$$\rightarrow \left(\mathbf{p}_{\pi_1} = \mathbf{p}_{\pi'_1} \wedge \mathbf{G}(i_{\pi_1} = i_{\pi'_1}) \wedge \left((\hat{d}_{\text{Out}}(\mathbf{o}_{\pi'_1}, \mathbf{o}_{\pi_2}) \leq \kappa_o) \mathbf{W} (\hat{d}_{\text{In}}(i_{\pi'_1}, i_{\pi_2}) > \kappa_i) \right) \right)$$

Analysis with HyperLTL

❖ S is *f-clean* iff it satisfies

$$\begin{aligned} & \forall \pi_1. \forall \pi_2. \exists \pi'_2. \\ & \left(\text{Plntrs}_{\pi_1} \wedge \text{Plntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1} \right) \\ & \rightarrow \left(\mathbf{p}_{\pi_2} = \mathbf{p}_{\pi'_2} \wedge \mathbf{G}(i_{\pi_2} = i_{\pi'_2}) \wedge \mathbf{G} \left(\hat{d}_{\text{Out}}(\mathbf{o}_{\pi_1}, \mathbf{o}_{\pi'_2}) \leq f(\hat{d}_{\text{In}}(i_{\pi_1}, i_{\pi'_2})) \right) \right) \end{aligned}$$

S is *f-clean* if for all $\mathbf{p}, \mathbf{p}' \in \text{Plntrst}$ and $i, i' \in \text{In}$,
whenever $i \in \text{StdIn}$,

$$\mathcal{H}(d_{\text{Out}})(S(\mathbf{p})(i), S(\mathbf{p}')(i')) \leq f(d_{\text{In}}(i, i'))$$

$$\mathcal{H}(d)(A, B) = \max \left\{ \begin{array}{l} \sup_{a \in A} \inf_{b \in B} d(a, b), \\ \sup_{b \in B} \inf_{a \in A} d(a, b) \end{array} \right\}$$

Analysis with HyperLTL

❖ S is *f-clean* iff it satisfies

$$\forall \pi_1. \forall \pi_2. \exists \pi'_2.$$

$$(\text{PIntrs}_{\pi_1} \wedge \text{PIntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1})$$

$$\rightarrow \left(\mathbf{p}_{\pi_2} = \mathbf{p}_{\pi'_2} \wedge \mathbf{G}(i_{\pi_2} = i_{\pi'_2}) \wedge \mathbf{G} \left(\hat{d}_{\text{Out}}(\mathbf{o}_{\pi_1}, \mathbf{o}_{\pi'_2}) \leq f(\hat{d}_{\text{In}}(i_{\pi_1}, i_{\pi'_2})) \right) \right)$$

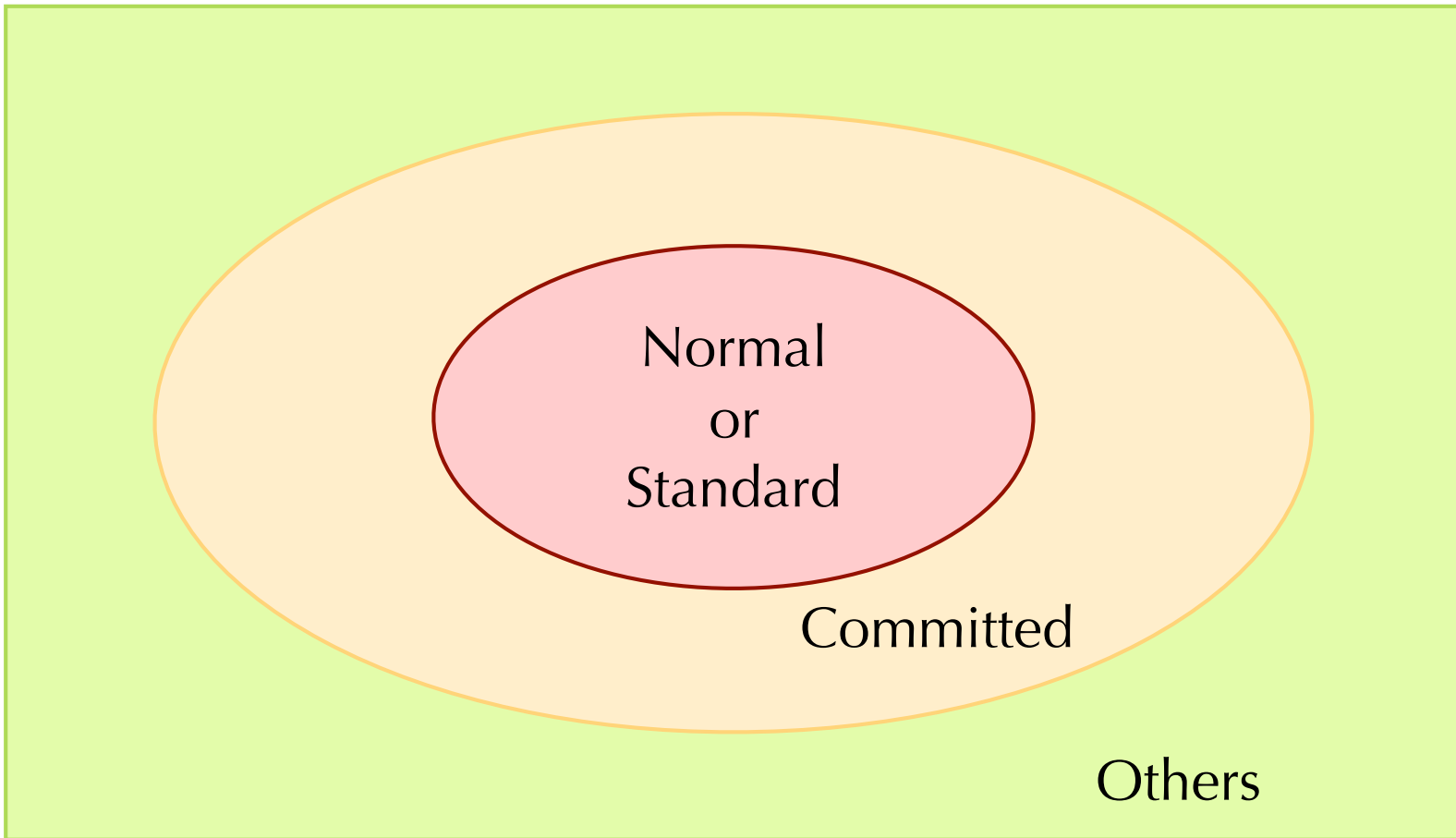
$$\forall \pi_1. \forall \pi_2. \exists \pi'_1.$$

$$(\text{PIntrs}_{\pi_1} \wedge \text{PIntrs}_{\pi_2} \wedge \text{StdIn}_{\pi_1})$$

$$\rightarrow \left(\mathbf{p}_{\pi_1} = \mathbf{p}_{\pi'_1} \wedge \mathbf{G}(i_{\pi_1} = i_{\pi'_1}) \wedge \mathbf{G} \left(\hat{d}_{\text{Out}}(\mathbf{o}_{\pi'_1}, \mathbf{o}_{\pi_2}) \leq f(\hat{d}_{\text{In}}(i_{\pi'_1}, i_{\pi_2})) \right) \right)$$

Model checked a toy version of the emission control case study

A general contract



Inputs

A general contract

S is *clean* if for all $p, p' \in \text{PIntrst}$ and $i, i' \in \text{In}$,

1. if $i \in \text{StdIn}$, $S(p)(i) = S(p')(i)$

2. if $i \in \text{StdIn}$ and $i' \in \text{Comm}$

$$\mathcal{H}(d_{\text{Out}})(S(p)(i), S(p')(i')) \leq f(d_{\text{In}}(i, i'))$$

3. if $i' \notin \text{StdIn} \cup \text{Comm}$, then for all ϵ , exists δ s.t. for all $i \in \text{In}$,

$$d_{\text{In}}(i, i') < \delta \Rightarrow \mathcal{H}(d_{\text{Out}})(S(p)(i), S(p')(i')) < \epsilon$$

Concluding remark

- ❖ We discussed what is software doping
- ❖ and motivate it with concrete examples
- ❖ Several formal characterizations of software doping
- ❖ They can be analyzed using self-composition
(for deterministic programs)
- ❖ We also studied characterizations for reactive
(non-deterministic) systems

Is your software on dope?

Formal analysis of surreptitiously “enhanced” programs

Gilles Barthe, Sebastian Biewer, **Pedro R. D’Argenio**,
Bernd Finkbeiner, and Holger Hermanns

IMDEA Software (ES)

UN Córdoba – CONICET (AR)

Saarland University (DE)

<http://www.cs.famaf.unc.edu.ar/~dargenio/>



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