



SMOKE SCIENCE / PRODUCT TECHNOLOGY
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The challenges associated with emission ceilings based on multivariate quantile

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Summary

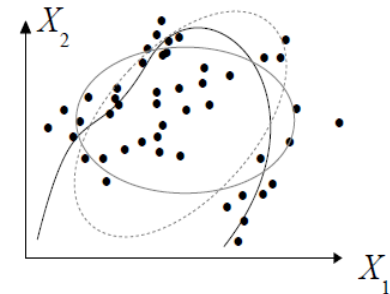
- The problem of constituent limitations

- Context
- How to deal with one constituent?
- Is it generalizable for several constituents?



- Building up rules for multiple constituent limitations

- Prioritisation
- Compensation
- Domination



The problem



Main issue:

limiting the quantity of certain constituents in smoke through banning-type rules

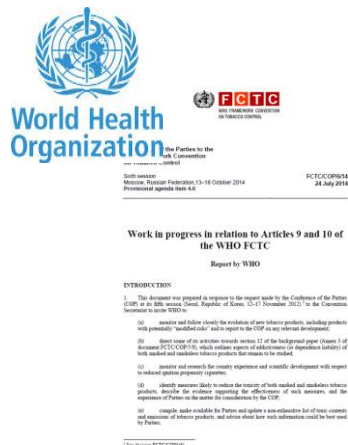


Table 3. Toxicants recommended for mandated lowering

Toxicant	Level in µg/mg nicotine		Value
	International brands ^a	Canadian brands ^b	
NNK	0.072	0.047	Median of data set
NNN	0.114	0.027	Median of data set
Acetaldehyde	860	670	125% of median of data set
Acrolein	83	97	125% of median of data set
Benzene	48	50	125% of median of data set
Benzo[a]pyrene	0.011	0.011	125% of median of data set
1,3-Butadiene	67	53	125% of median of data set
Carbon monoxide	18400	15400	125% of median of data set
Formaldehyde	47	97	125% of median of data set

NNK, 4-(*N*-nitrosomethylamino)-1-(3-pyridyl)-1-butanone; NNN, *N*¹-nitrosornicotine

^a Based on data from Counts et al., 2005

^b Based on the data reported to Health Canada minus brands with levels of NNN per mg nicotine > 0.1 ng, which eliminates most US and Gauloise brands. (http://www.hc-sc.gc.ca/hl-vs/tobac-tabac/legislation/reg/indust/constitu_e.html)

Constraint:

Take into account the complexity of the products on the market such as inter-relationships between constituents and the consequences of existing regulations (excluding already a large number of products)

Two aspects of the constraint



Which characteristics of banned products should be considered ? Can this be advocated?
How to define the limits and which rules of decision to reject or accept products?



How to control the proportion of products that the rule will ban?

One constituent



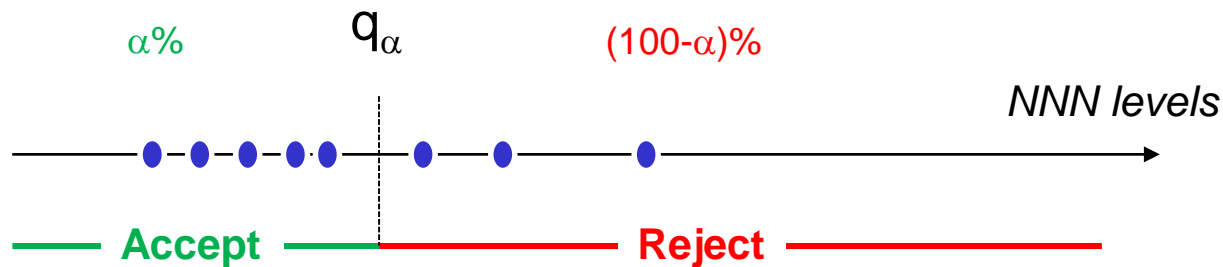
Clarity

To regulate one constituent (for instance NNN), the only one possibility consists to define a limit and to reject all products with a level above this limit.



Feasibility

To keep $\alpha\%$ of the products, the limit must be a q_α -quantile



Can we generalise to multi-constituents?

More than one constituent

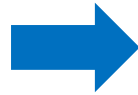
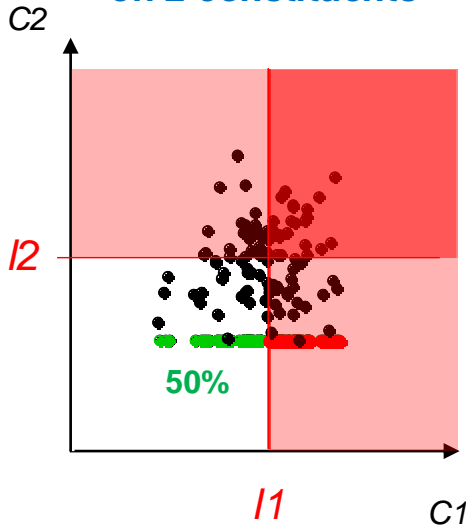
Clarity of the rule:

To regulate independently several constituents, a lot of decision rules exist (no uniqueness of the rules).

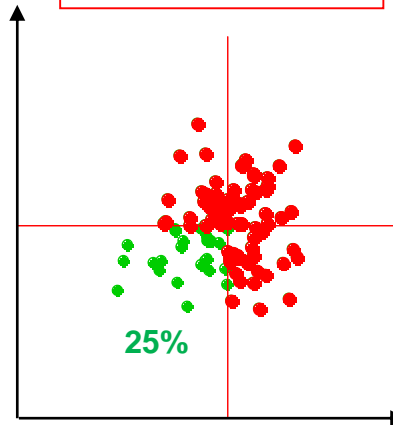


Example

Multi ceiling based on 2 constituents

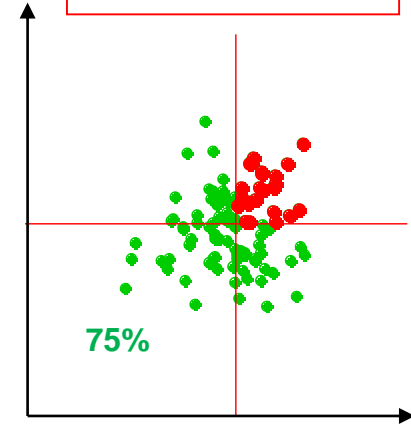


Rejected if:
 $C1 > I1$ OR $C2 > I2$



A product is rejected if at least 1 of the constituents exceed his limit

Rejected if:
 $C1 > I1$ AND $C2 > I2$



A product is rejected if the 2 constituents exceed their limits

Rule definitions

Multiple ceilings based on K constituents

A product is rejected if at least k of the constituents exceed the limit. With k in $\{1, \dots, K\}$

More than one constituent



Feasibility of the rule:

Becomes tricky, because the proportion of the banned products depends dramatically on an interaction of the rule and the statistical dependencies between constituents

Multi ceiling based on 2 constituents With the rule at least one constituent exceed his limit

Formaldehyde vs NNN*

Feasibility of the rule

For instance keep
50% of the products

49%

Very high
dependency

25%

Very low
dependency

17%

Real situation



Impossible to master the proportion of products that the rule will ban.

*Counts ME & al. Smoke composition and predicting relationships for international commercial cigarettes smoked with three machine-smoking conditions. Regul Toxicol Pharmacol 2005;41:185–227.

More than one constituent

Feasibility of the rule:

Becomes tricky, because the proportion of the banned products depends dramatically on an interaction of the rule and the statistical dependencies between constituents



Multi ceiling based on 2 constituents

With the rule the two constituent exceed their limits

Formaldehyde vs NNN*

Feasibility of the rule

For instance keep 50% of the products

50%

Very high dependency

75%

Very low dependency

84%

Real situation



Impossible to master the proportion of products that the rule will ban.

*Counts ME & al. Smoke composition and predicting relationships for international commercial cigarettes smoked with three machine-smoking conditions. Regul Toxicol Pharmacol 2005;41:185–227.

Summary part 1:

Over one constituent, the approaches that do not consider the dependency patterns between constituents **fail to define robust rules**:

The constraints of clarity and feasibility are not satisfied.

As a consequence, it is very difficult to anticipate the impact of such rules on commercial products and a market*.

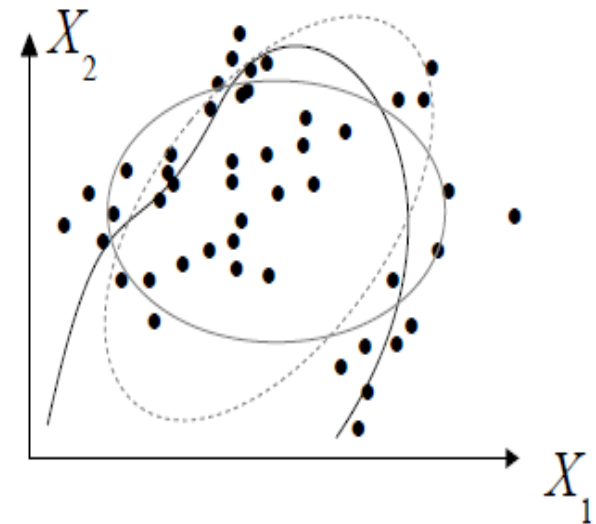
As show by X. Cahours et al, up to 86% products would be rejected using the rules suggested by WHO*



Building up rules for multiple constituent-limitation

Building up rules for multiple constituent-limitation

1. Prioritisation
2. Compensation
3. Domination

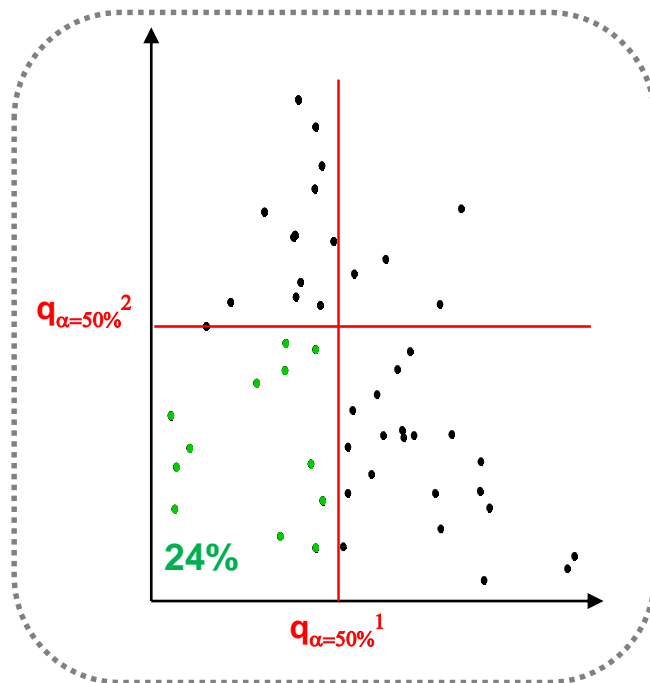


Prioritisation

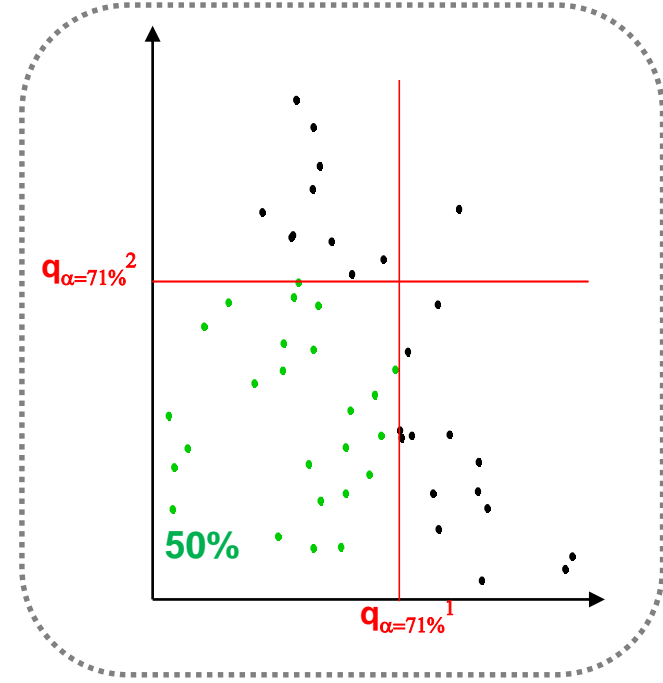
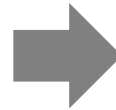
Operation: Perform limitation following a hierarchical process.

Algorithm

Compute the quantile q_{α}^1 for the first priority constituent
For i in 2 to K
 Keep all products lower the quantile q_{α}^{i-1}
 Compute the quantile q_{α}^i for the second priority constituent



To keep α % products
re-adjust quantile to
 $\alpha \frac{1}{K}$ ($0.5 \frac{1}{2} = 0.71$)



Limitations: What hierarchy between constituents ? Asymmetric treatment => depend on hierarchy.

Compensation

Operation: Perform a linear compensation

Aggregating constituents through an a priori formula:

$$\Phi_a = \left(\sum_k \pi_k (x_k)^a \right)^{\frac{1}{a}}$$

Algorithm

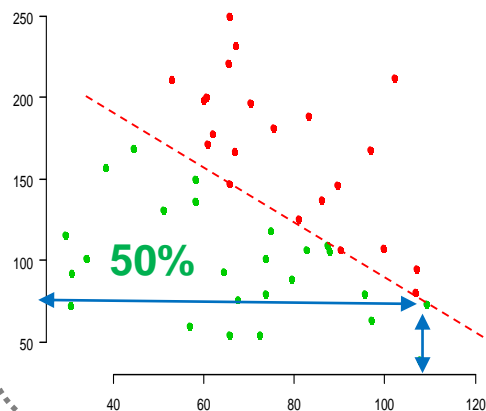
Variable that conditions the rejection area

Constituent k

Weight of constituent k

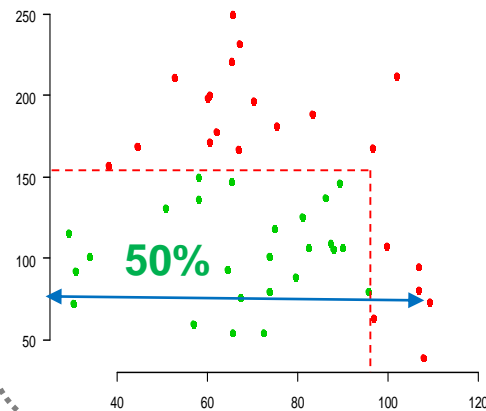
$a = 1$
 $\Phi_1 =$ classical average

No priority = compensation



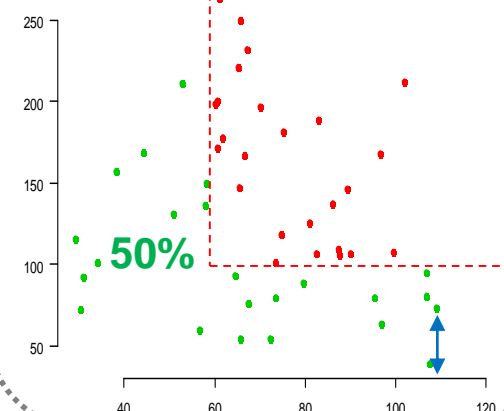
$a \rightarrow +\infty$
 $\Phi_{+\infty} = \max(\pi_k (x_k)^a)$

Priority given to high levels



$a \rightarrow -\infty$
 $\Phi_{-\infty} = \min(\pi_k (x_k)^a)$

Priority given to low levels



Limitations: choice of the standardisation and tuneable parameters (power, weight)

Domination

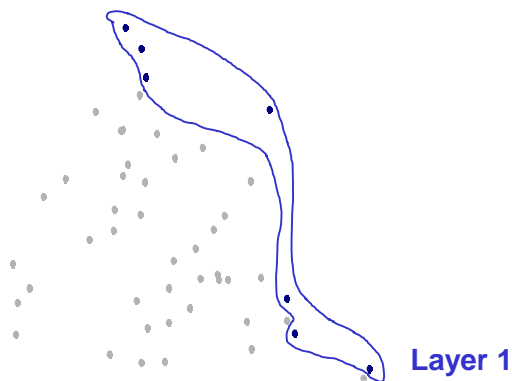
Operation: Perform a layer-method based on a domination criterion

Definition

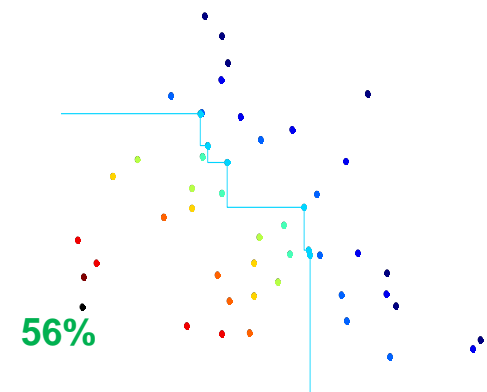
A product a (strictly) dominates another b if it has greater or equal values for *all* constituents, and strictly greater for at least one constituent.

Algorithm

Layer 1 (top of order) consists of all products that are strictly dominated by *no other*. Each subsequent consists of all points that are strictly dominated by some products of former layers *only*.

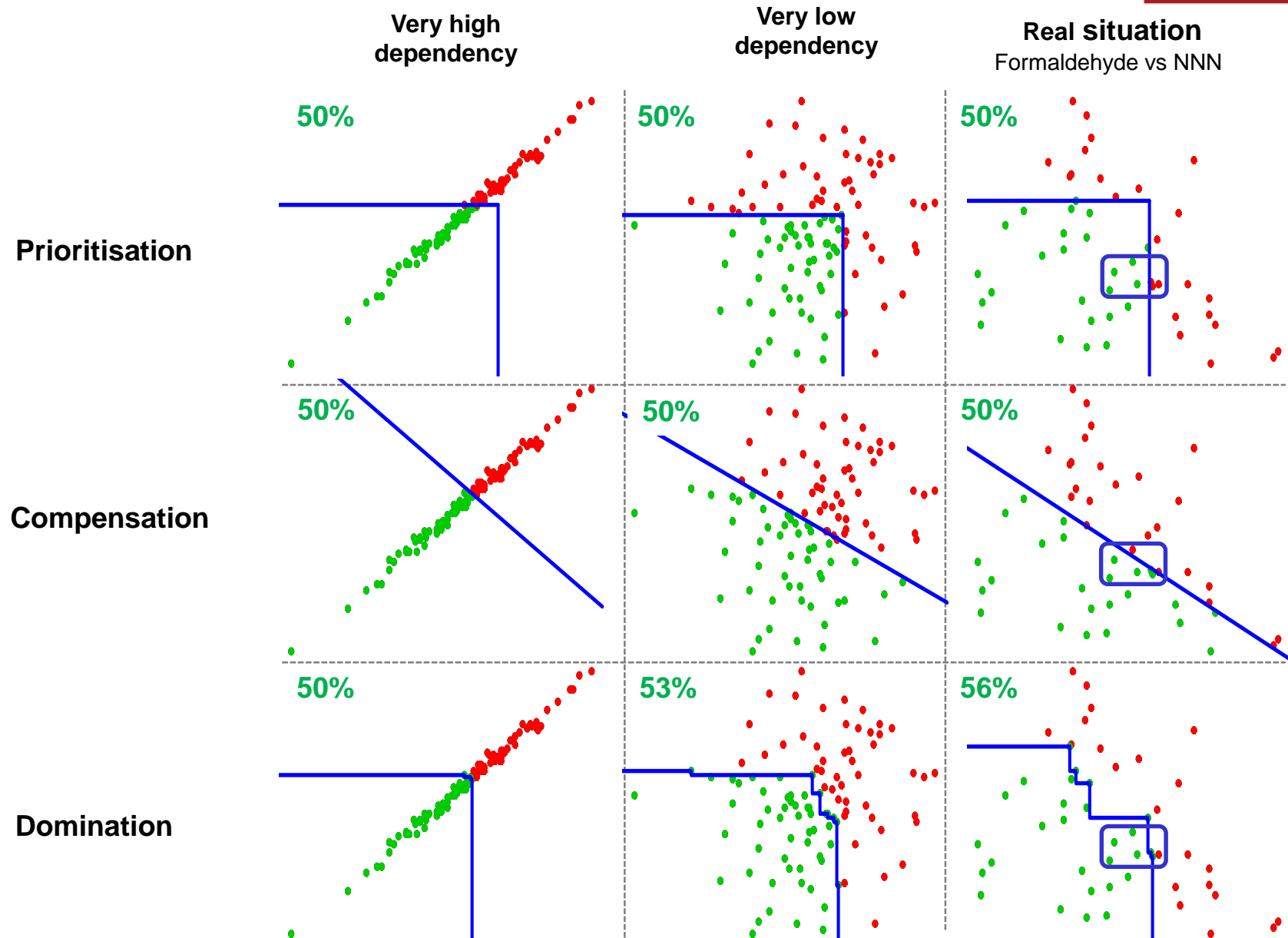


Repeat the process



Limitations: Sensitive to the number of constituents. Too many constituents would lead to a lack of domination.

Application



What did we learn?

Need

to consider the complexity of the products on the market and the dependency patterns between constituents to define appropriate decision rules

Must

use multidimensional approaches

Have

some limitations:

- Acceptation or rejection of products depends on the decision rules
- Interpretation of product decision can be difficult
- An increase of the number of constituents to regulate reduces the feasibility of the rules

BUT

Beyond simply reducing the number of products on a market, the purpose and benefit of rejection should be defined first.

너의 주의를 위해 너를 감사하십시요

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www.imperialtobaccoscience.com

