

# **QSAR: Discovery and First Steps**

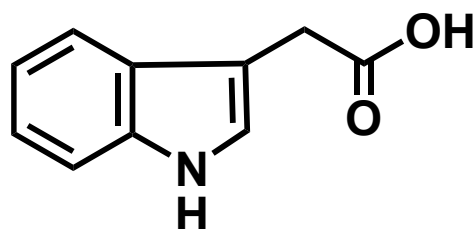
**Toshio Fujita**

**Kyoto University**

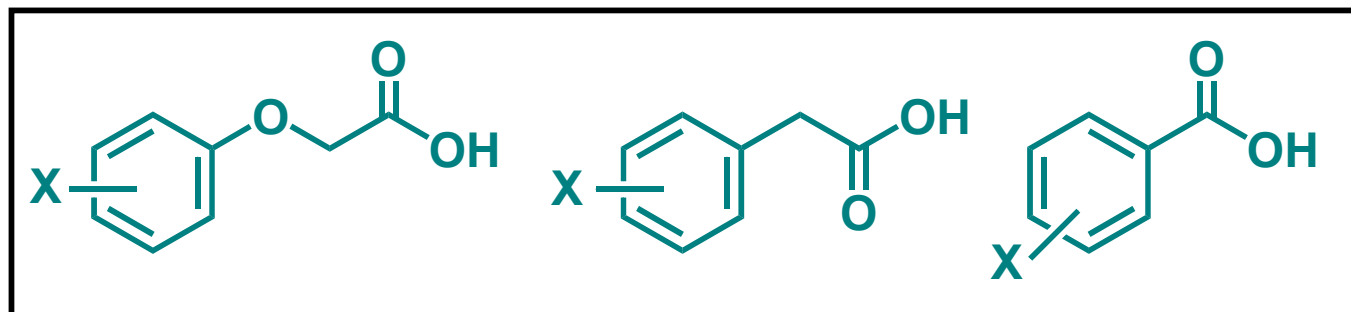
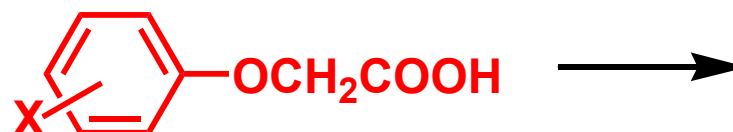
**Kyoto, Japan**

# Origin of Classical QSAR is from the SAR Studies of Agrochemicals—— Plant Growth Regulators/Herbicides

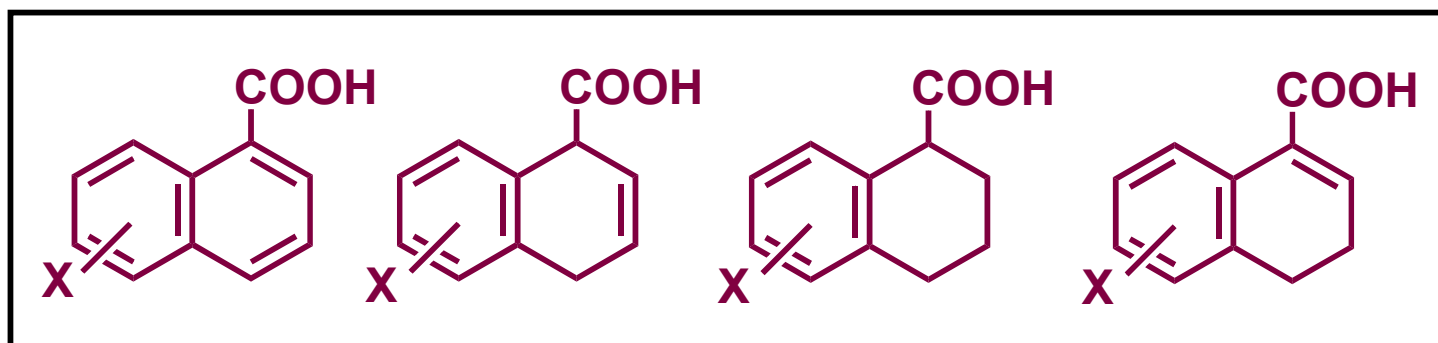
Indole-3-acetic acid



Phenoxyacetic acids

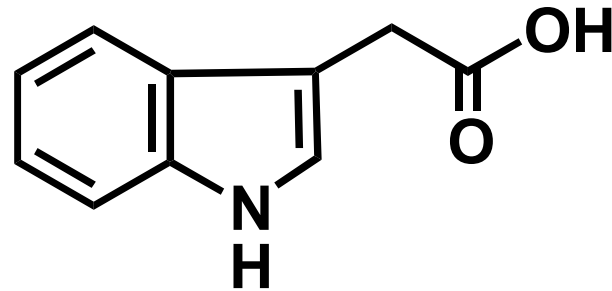


Hansch and Muir  
at Pomona  
(1946 ~ )



Mitsui, Fujita  
and others  
at Kyoto  
(1950 ~ )

# Identification of Natural Plant Growth Regulator



**Indole-3-acetic acid (Auxin)**

**Isolated from Human Urine**

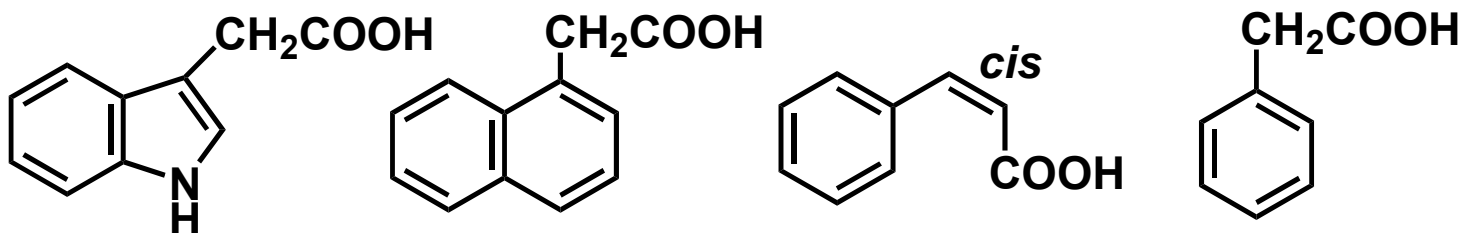
**F. Kögl, A. J. Haagensmit, H. Erxleben,  
Z. Physiol. Chem. 228, 90 (1934)**

**Receptor Protein Identified Recently**

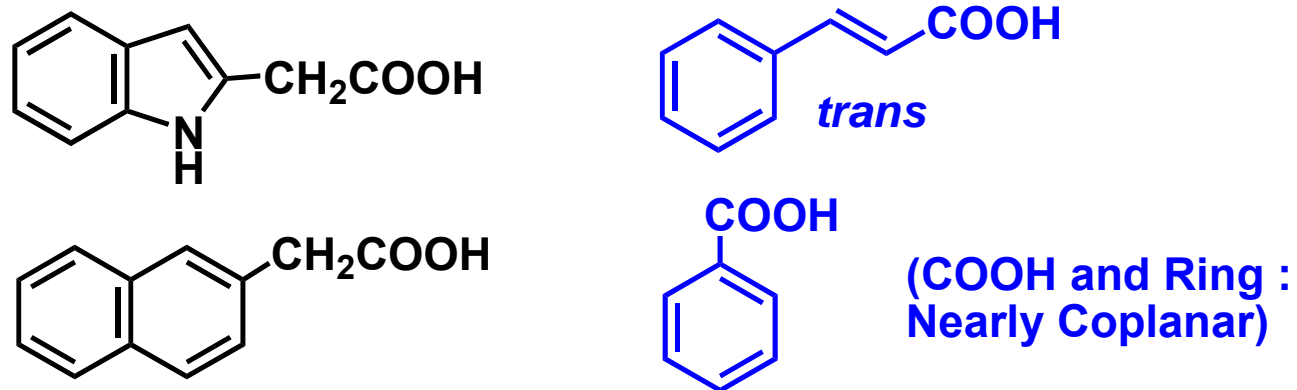
**N.Dharmasiri, S.Dharmasiri, M.Estelle,  
Nature 435, 441 (2005)**

# Structure and Plant Growth Activity

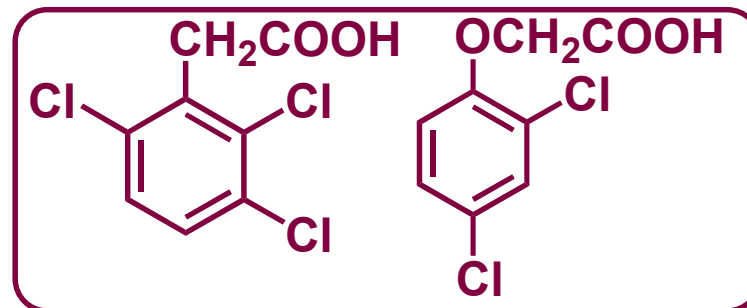
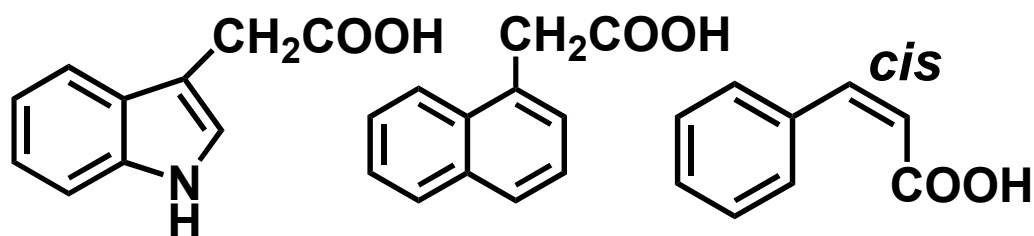
## Highly Active and Active



## Weakly active and Inactive



# SAR (Qualitative "Rules" ) for Plant Growth Regulators/Herbicides



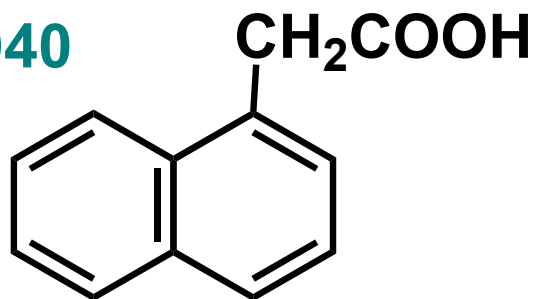
- 1) Ring Structure with Unsaturated Bonds
  - \*2) Carboxyl Group Separated by at least One Carbon Atom from the Ring
  - \*3) A Free Hydrogen Atom at the  $\alpha$ -Position to the Carboxyl Group
  - 4) Specific Spatial Relationship between the Ring and the Carboxyl Group
- (Koepfli, Thimann, Went 1938)

\* ammended subsequently

Substituted phen(ox)yl acetic acids as potent regulators/herbicides were discovered after 1940.

# Discovery of Agricultural Herbicides at ICI

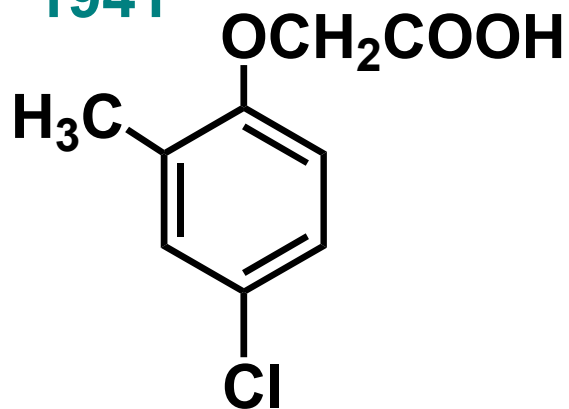
1940



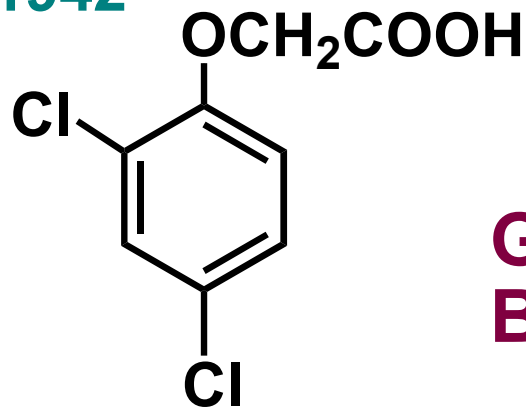
27 kg/ha

Oats vs. yellow charlock

1941



1942



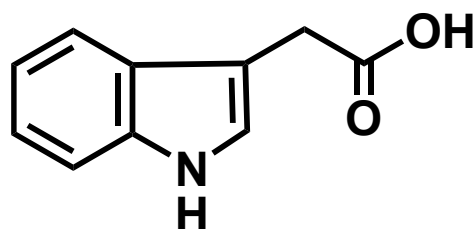
ca. 0.5 kg/ha

Grass crops vs.  
Broad leaf weeds

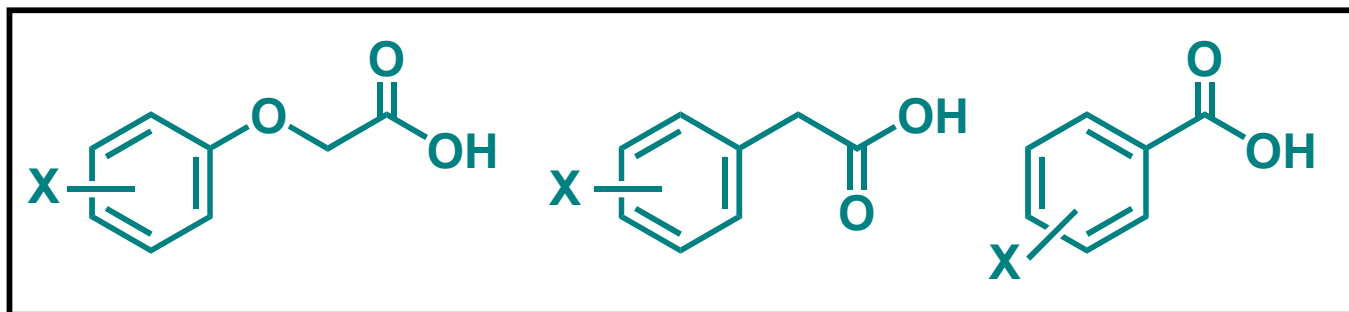
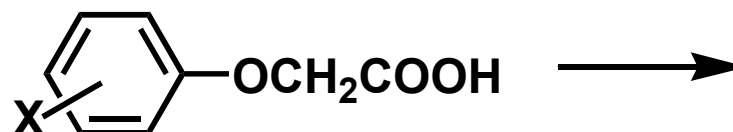
Selective Toxicity eradicating  
weeds to protect crops.

# Origin of Classical QSAR is from the SAR Studies of Agrochemicals—— Plant Growth Regulators/Herbicides

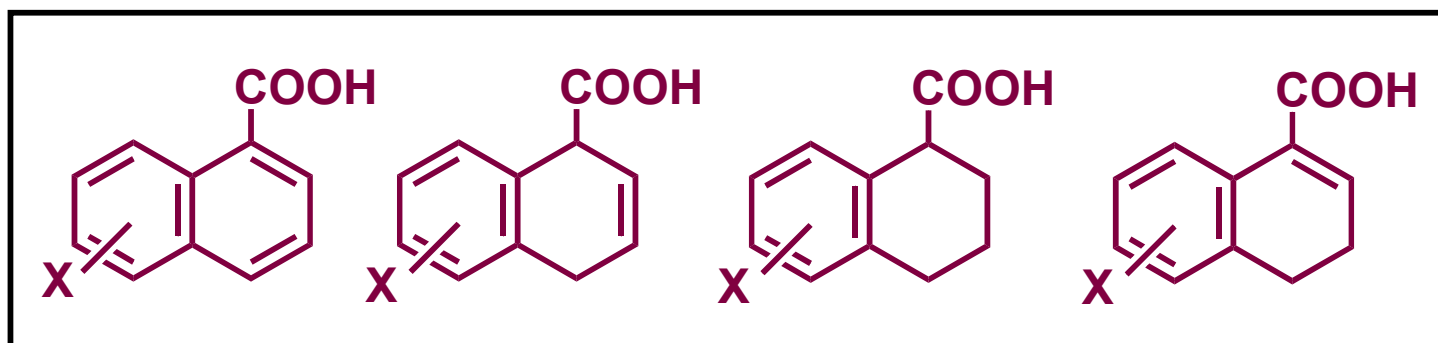
## Indole-3-acetic acid



## Phenoxyacetic acids



Hansch and Muir  
at Pomona  
(1946 ~ )



Mitsui, Fujita  
and others  
at Kyoto  
(1950 ~ )

# Substitution Patterns and the Activity

	Very Active ~ Active	Inactive
Benzoic Acids	2,3,5-I <sub>3</sub> , 2,3,6-Cl <sub>3</sub> , 2,5-Cl <sub>2</sub> -6-OMe 2,5-Cl <sub>2</sub> -3-NH <sub>2</sub> , 2,5-Cl <sub>2</sub> , 2,4,5-Cl <sub>3</sub> -3-NH <sub>2</sub> -6-Aza, 2,3-Cl <sub>2</sub> , 2-Br, 2-Cl, 2-NO <sub>2</sub> , 2-F-6-Cl, 2,6-Cl <sub>2</sub> , 2-Cl-5-F.	H, 3- and 4-Halogeno, 3- and 4-NO <sub>2</sub> , OH, NH <sub>2</sub> , 2,4-Cl <sub>2</sub> , 3,4-Cl <sub>2</sub> , 3,5-Cl <sub>2</sub> , 2,6-OMe <sub>2</sub> , 2-F-5-Cl, and many more.
Phenyl-acetic Acids	2,3,6-Cl <sub>3</sub> , 3-Halogeno, 2,3-(CH) <sub>4</sub> , 3-CF <sub>3</sub> , 2- and 3-Br, 2- and 3-Cl, 2- and 3-Me, 2- and 3-CN 2- and 3-OMe, 3-NO <sub>2</sub> , H.	4-CN, I, NO <sub>2</sub> , 4-COCH <sub>3</sub> , 4-NHCOCH <sub>3</sub> and many more.
Phenoxy-acetic Acids	2,4-Cl <sub>2</sub> , 2-Me-4-Cl, 3,4-(CH) <sub>4</sub> , 2,4,5-Cl <sub>3</sub> , 3-CF <sub>3</sub> , 4-Cl, 3-I, 4-F, 3-Br, 2,5-Cl <sub>2</sub> , 3-Cl, 3-OMe, 3-Me, 3-Et, H.	2,6-Cl <sub>2</sub> , 4-Me, I, NO <sub>2</sub> , 4-Ac, COCH <sub>3</sub> , Et, CN, 3-NHCOCH <sub>3</sub> , Bu, 2,3-(CH) <sub>4</sub> , and many more.



# Structure-Activity Patterns

**Importance of 2- and 2,6-Substitution  
Patterns favorable to the High Activity.**

**2,6-Disubstitution in Benzoic and  
Phenylacetic but not in Phenoxyacetic  
Acids, 2,6-(OMe)<sub>2</sub> being unfavorable.**

**Electron-attracting Cl substitutions are  
favorable to the activity depending on  
structures and ring positions.**

**Importance of 2- and 2,6-Substitution  
Patterns favorable for High Activity**

**Proposal of H. Veldstra (Leiden University)**

- (1) "Lipophilic" Ring with Multiple Substitutions
- (2) Steric Repulsion of "Proximity Substituents" toward Carboxyl group so as to deviate from the Coplanarity



- (1) **A Basal Ring System (Nonpolar L-moiety) with a High Interface Activity.**
- (2) **A Carboxyl Group (or surrogates) (Polar H-moiety) situated with respect to the Ring System as Peripheral and Perpendicular as Possible with an Optimum H/L Balance.**

**Reasonably Hydrophobic Ring System (with Substituents) and Steric Conditions (Noncoplanar) of the COOH Group**

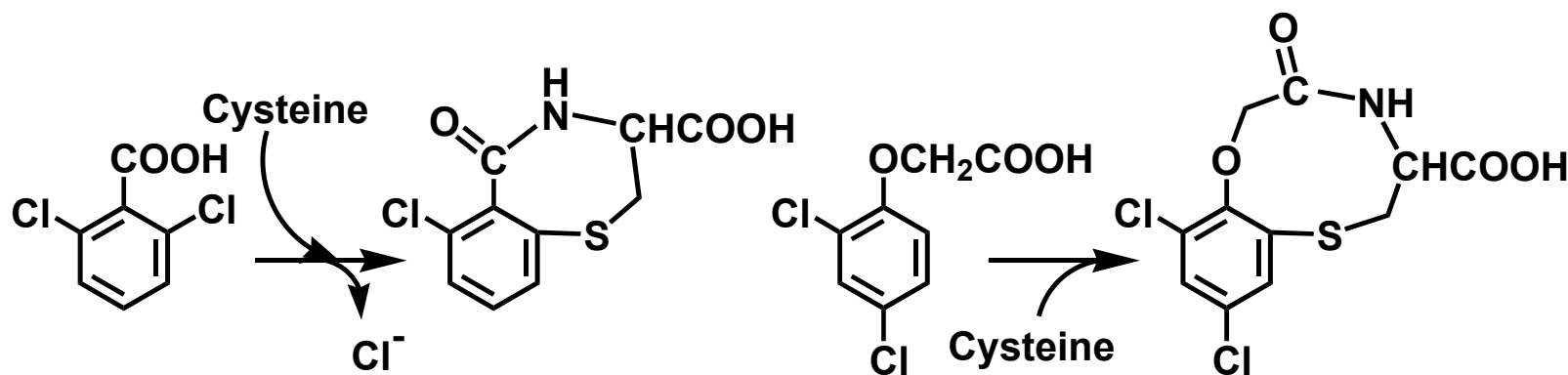
**Veldstra (1953)**

## Importance of 2- and 2,6-Substitution Patterns favorable for High Activity

### Proposal of C. Hansch (Pomona College)

- (1) Activity Enhancements due to "Electron-Withdrawing" Substituents could be elucidated by Nucleophilic Attack of Biological Components.
- (2) Importance of the "Reactivity" at One of the Ortho Positions.

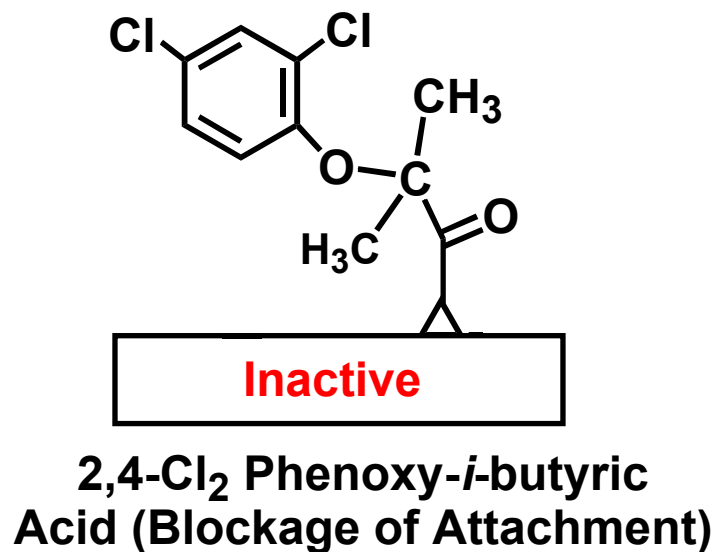
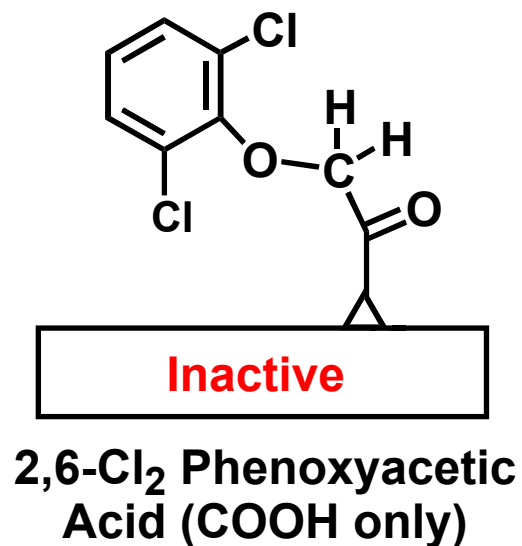
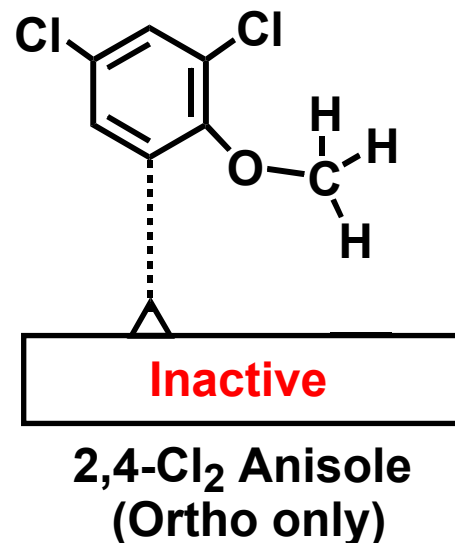
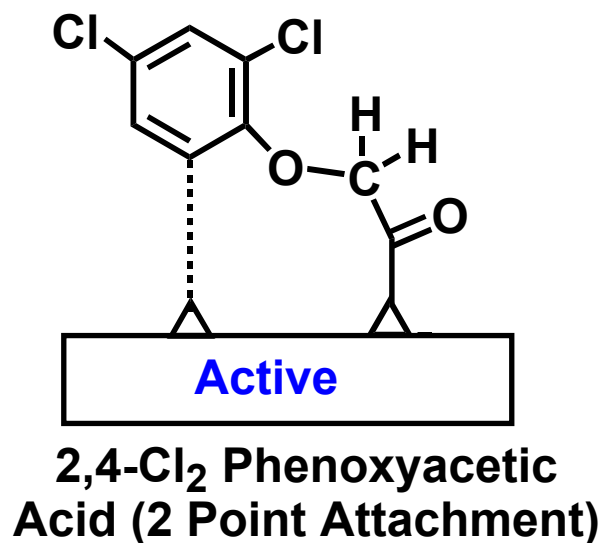
#### Nucleophilic Susceptibility at the Ortho Position



**Two point Attachment Hypothesis:**  
The COOH Group and one of the Ortho Positions

Hansch et al. (1951)

## Two Point Attachment Hypothesis McRae and Bonner (1952)



## Susceptibility Index to Nucleophilic Attack to the **Ortho** Position and Plant Growth Activity of Substituted Benzoic Acids

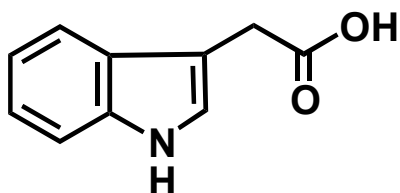
	$S'_r(N)$	Activity		$S'_r(N)$	Activity
2,5-Cl <sub>2</sub>	0.777	++	3-Cl	0.643	Inactive
2,4-Cl <sub>2</sub>	0.719	Inactive	3-F	0.636	Inactive
2,3,6-Cl <sub>3</sub>	0.359	++++	3-OH	0.635	Inactive
2-Cl	0.709	+	3-Br	0.633	Inactive
2,3,5-Cl <sub>3</sub>	0.707	++++	3-I	0.631	Inactive
2,4,6-Cl <sub>3</sub>	0.692	Inactive	4-Cl	0.620	Inactive
2-Br	0.683	+	4-I	0.616	Inactive
2-I	0.681	+	4-Br	0.614	Inactive
2-Br-6-Cl	0.678	+	2-OH	0.613	Inactive
3-Me	0.671	Inactive	2-F	0.610	Inactive
2,6-Cl <sub>2</sub>	0.669	+	3,4,5-I <sub>3</sub>	0.608	Inactive
2,6-Br <sub>2</sub>	0.650	Inactive	H	0.602	Inactive
2-Me	0.648	Inactive	2-NH <sub>2</sub>	0.601	Inactive

$S'_r(N)$  : Superdelocalizability of the frontier MO for susceptibility to  
"nucleophilic attack".

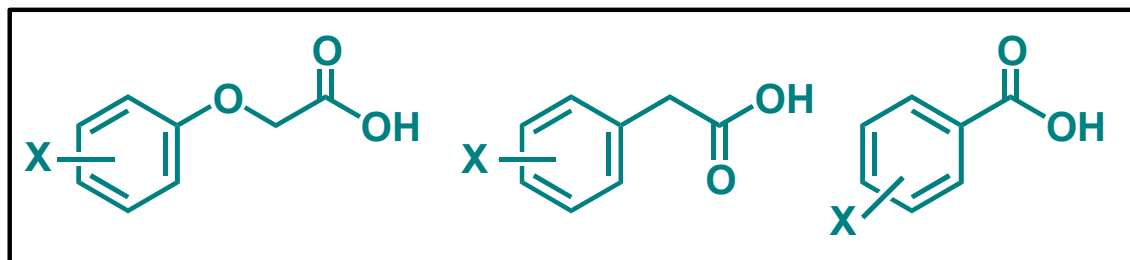
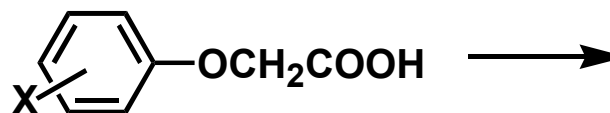
Fukui, Nagata et al. (1958)

# Origin of Classical QSAR is from the SAR Studies of Agrochemicals—— Plant Growth Regulators/Herbicides

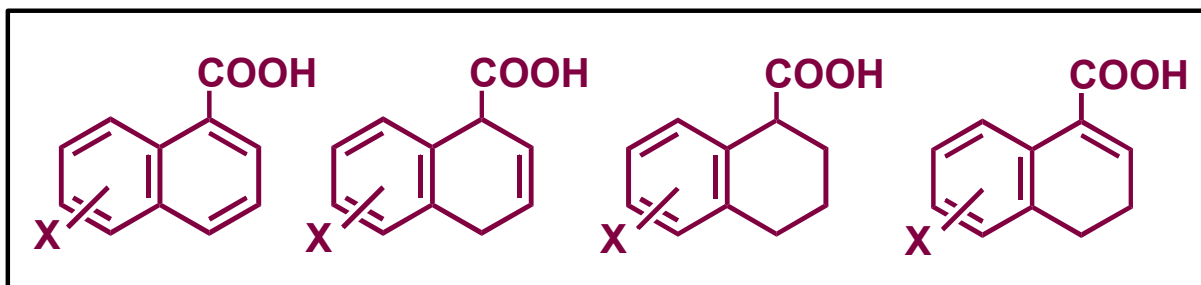
Indole-3-acetic acid



Phenoxyacetic acids

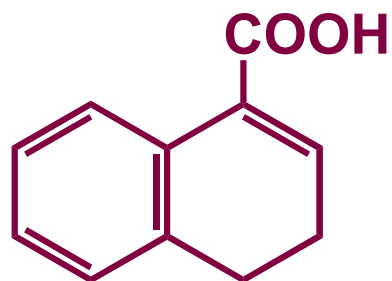
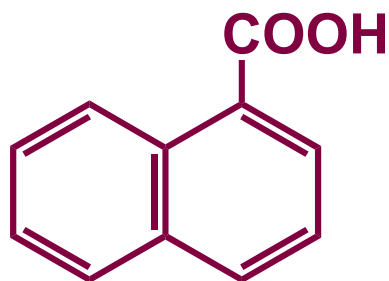


Hansch and Muir  
at Pomona  
(1946 ~ )



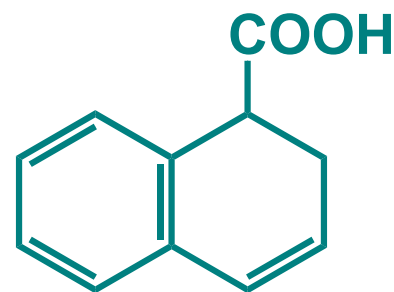
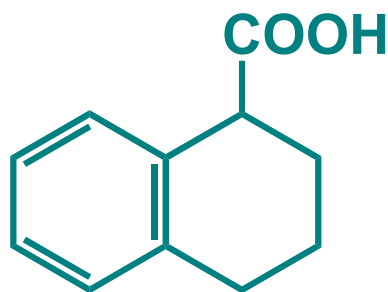
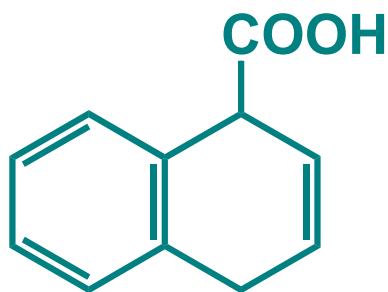
Mitsui, Fujita  
and others  
at Kyoto  
(1950 ~ )

## Activity Profile of (Hydro)-1-Naphoic Acids



"Violation" of Rules #2 and 3.

Only weakly active.



Being regarded as  $\alpha$ -alkyl substituted phenylacetic acids in which the side chain is cyclized.

Highly ~ Moderately Active

Effect of substituents on the aromatic moiety.

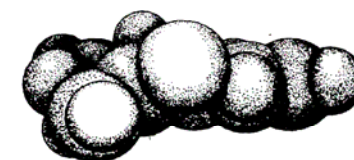
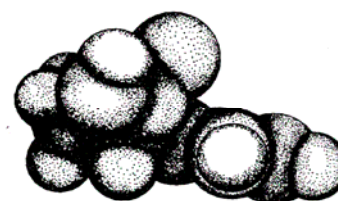
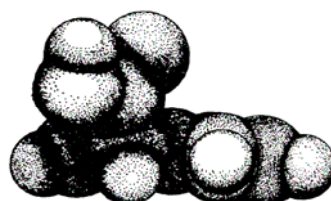
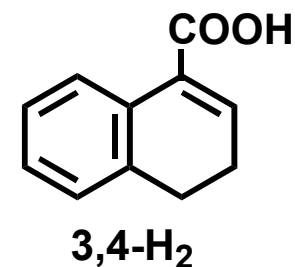
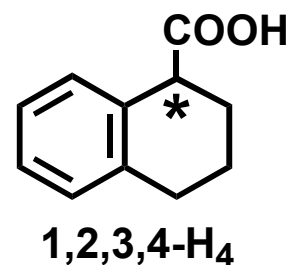
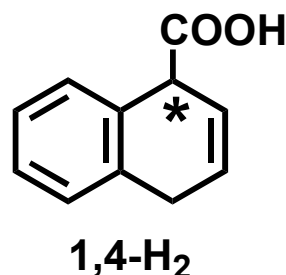
# Plant Growth Activity of Partially Hydrogenated 1-Naphthoic Acids

Fujita, Mitsui et al. (1951~ )

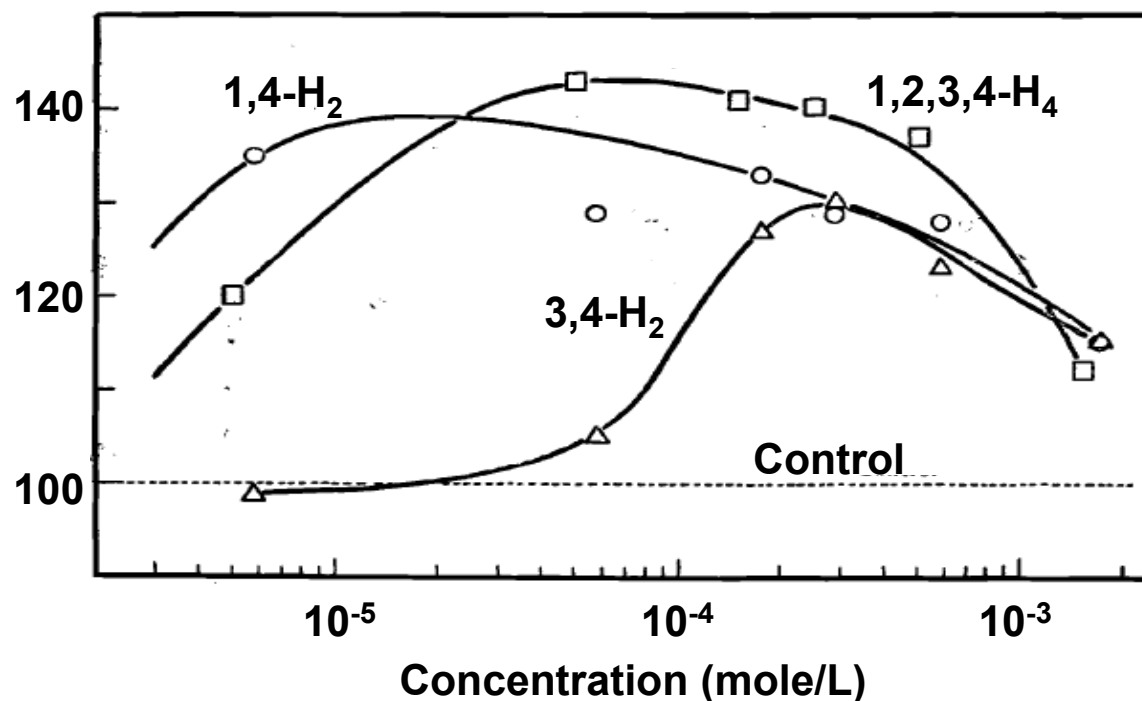
Bioassay: Straight  
Growth of Pea Sprout  
Stem

The S form (\*) is more  
Active than L.

Activity seems to  
parallel with the  
angle (or Non-coplanarity)  
of the "COOH" relative  
to the ring-plane.



Growth %

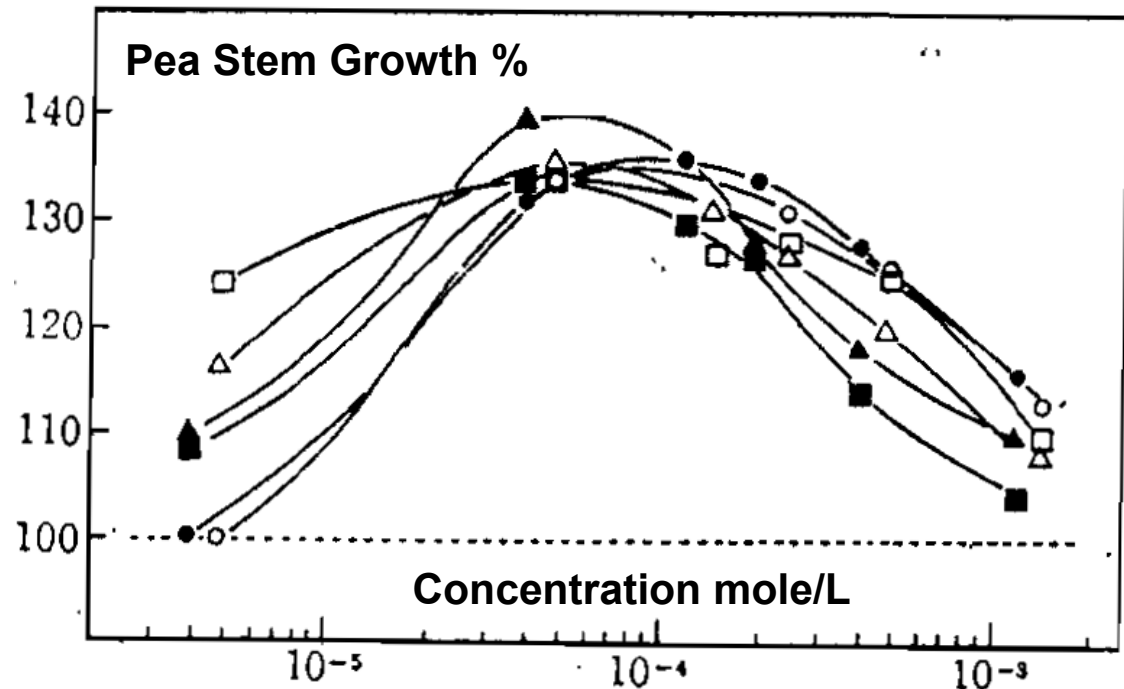
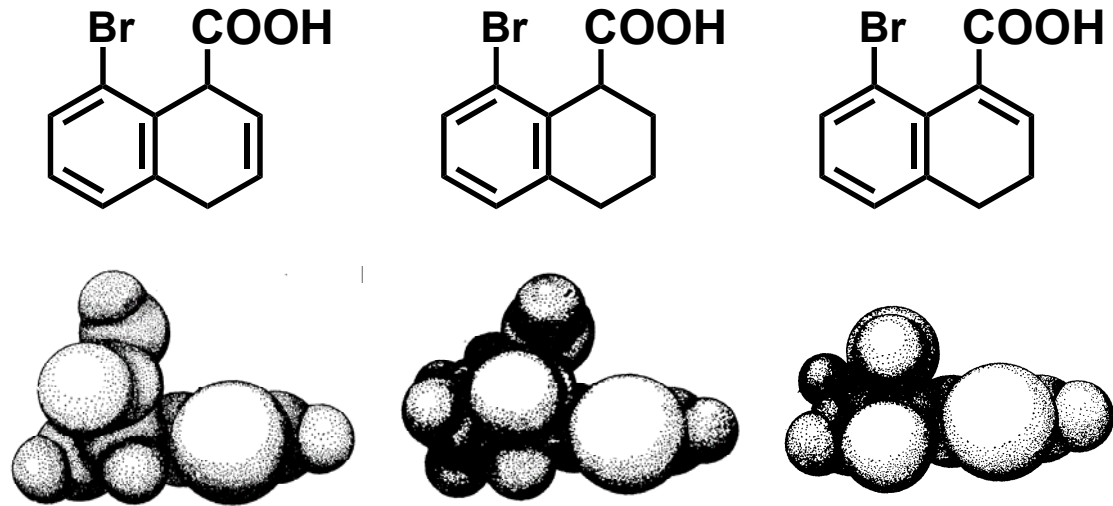
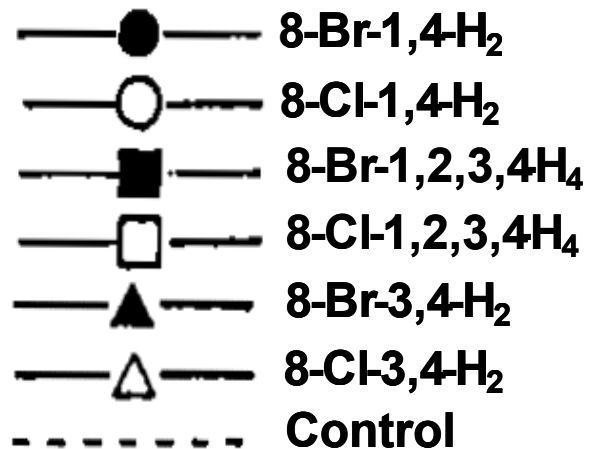




# Plant Growth Activity of 8- Halogeno-Hydro- 1-Naphthoic Acids

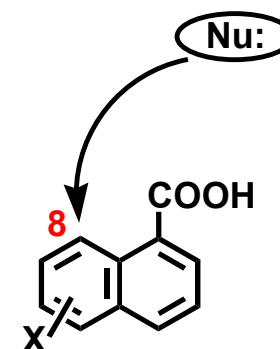
Fujita et al. (1961 )

Substitution at peri  
(8)-position causes  
repulsion or twisting  
of COOH.



## Susceptibility Index to Nucleophilic Attack and Plant Growth Activity of Substituted 1-Naphthoic Acids

	$S'_r(N)$	Activity		$S'_r(N)$	Activity
5-NO <sub>2</sub>	1.384	+	6-Cl	0.216	+
4-NO <sub>2</sub>	0.699	+	6-Br	0.214	+
8-Cl	0.359	+++	8-Me	0.213	+++
8-Br	0.345	+++	3-Cl	0.212	Inactive
2-Cl	0.331	+++	3-Br	0.212	Inactive
5-Br	0.279	Inactive	H	0.211	++
5-Cl	0.278	Inactive	3-Me	0.207	Inactive
2-Me	0.254	+	6-Me	0.201	Inactive
4-Cl	0.244	+	4-Me	0.148	Inactive
4-Br	0.234	+	6-NO <sub>2</sub>	0.139	Inactive
8-NO <sub>2</sub>	0.217	+	3-NO <sub>2</sub>	0.110	Inactive



$S'_r(N)$  : Superdelocalizability for Nucleophilic Susceptibility in the frontier orbital; Calculated with Simple Hückel LCMO method at the **8-position**, The result was taken to indicate not necessarily nucleophilic substitution but an interaction due to charge-transfer is possible.

Twisted conformation (60°) of COOH and NO<sub>2</sub> for 2- and 8-positions, and coplanar conformation for others.

Koshimizu and Fujita (1960)

## The "Birth" of the Multi-variable Approach (I)

- (1) Variations in the activity are obviously governed by not a single but plural physicochemical parameters at the same time.
- (2) Most of growth regulators are aromatic, and the potency varies depending upon the substituent effects. Then, one of parameters determining the potency variations can be the Hammett  $\sigma$  constant representing the electron withdrawing character of substituents.

Definition of the Hammett  $\sigma$  :



$$\sigma = \log K_A^{\text{X}} - \log K_A^{\text{H}}$$

- (3) Other possible parameters to be considered are those for steric and hydrophobic (lipophilic).

## The "Birth" of the Multi-variable Approach (II)

(1) To represent the hydrophobicity of the entire molecule,  $\log P$ ,  $P$  being the partition coefficient measured with the 1-octanol/water system was selected.

(2) In aliphatic systems, variations in the reactivity ( $k$ ) of a series of compounds is often formulated in a form of linear combination of free-energy-related parameters.

$$\log k = \rho\sigma^* + \delta E_s ,$$

$E_s$ : Taft steric parameter,

$\sigma^*$  : Aliphatic counterpart of the Hammett  $\sigma$ ,

$\rho$ ,  $\delta$  are the coefficient of respective terms.

(3) Definition of Hydrophobicity Substituent Constant  $\pi$ :

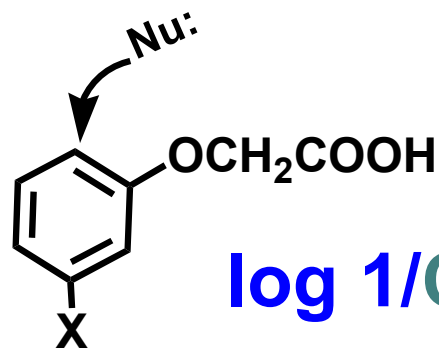
$$\pi = \log P \text{ of } \left[ \text{X} \text{---} \text{C}_6\text{H}_4 \text{---} \text{Y} \right] - \log P \text{ of } \left[ \text{H} \text{---} \text{C}_6\text{H}_4 \text{---} \text{Y} \right]$$

$\pi$  of certain X substituents varies with Y to some extent.

(4) Linear combination of  $\sigma$  and  $\pi$  parameters for the analysis.

$$\log 1/C = a\pi + \rho\sigma + \text{constant}$$

# Plant Growth Activity of "*m*"-Substituted Phenoxyacetic Acids



$$\log 1/C = -1.97 \pi^2 + 3.24 \pi + 1.86 \sigma_p + 4.16$$
$$s = 0.484, r = 0.881, r^2 = 0.776$$

The first QSAR equation in JACS (1963)

$n = 21$  including 17 meta-substituted derivatives  
(CF<sub>3</sub>, 4-Cl, I, 4-F, Br, SF<sub>5</sub>, Cl, NO<sub>2</sub>, SMe, Et, SCF<sub>3</sub>,  
3,4-(CH)<sub>4</sub>, OMe, Me, CN, Pr, 4-OMe, Ac, F, H)

C: Molar concentration producing 10% increase  
above control in the length of 3mm oat seedlings

Hansch et al. (1963)

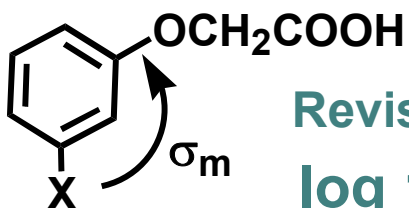
## Features of the QSAR

- (1) The  $\sigma_p$  parameter works much better than  $\sigma_m$ .
- (2) There is "an optimum" in the  $\pi$  parameter for substituents expressible by the parabola model.

## Conditions for the QSAR

- (1) 4-Substituted derivatives with substituents larger than Cl is inactive.
- (2) 3-Substituted derivatives with substituents larger than Pr is inactive.
- (3) There is a limit for 3,5-disubstitution in "lateral" width.
- (4) The proximity effects of ortho-substituents were not estimable at that time in terms of Hammett-Taft type parameters.
- (5) The set of meta plus a few para substituted derivatives was only a set of compounds of which activity was accurately measurable.

# Plant Growth Activity of *m*-Substituted Phenoxyacetic Acids (II)



Revision by Verloop (1981)

$$\log 1/C = 1.04\pi + 0.59\sigma_m - 0.67(L)^2 + 4.78 L - 3.87$$

$n = 19$  (not including 4-isomers),  $s = 0.376$ ,  $r^2 = 0.874$

Revision by Hansch (1995)

$$\log 1/C = 1.25\pi + 0.97\sigma_m + 0.95 L - 5.54 \log(\beta \times 10^L + 1) + 1.39$$

$$n = 19 \text{ (not including 4-isomers), } s = 0.242, r^2 = 0.951, L(\text{opt}) = 3.74$$

- (1) The  $\sigma_m$  parameter works much better than  $\sigma_p$  by considering the  $L$  parameter along with its optimum for meta substituents.
- (2) The optimum can be represented either by parabola or **the Kubinyi bilinear model**.
- (3) The hypothesis of the two-point attachment involving one of the ortho positions was abandoned.
- (4) Hydrophobic, electronic, and steric effects of meta substituents are nicely separated in this revised equation.
- (5) ' $L$ ' is the length parameter, one of the Verloop STERIMOL parameters.
- (6)  $L(\text{opt}) = 3.74$  corresponds with OMe, beyond which activity falls off sharply.

# Classical QSAR for Series of Substituted Analogs

$$\Delta(\text{Biological Response}) = f(\Delta E_1, \Delta E_2, \Delta E_3, \dots)$$

$E_n$ : Various “Free-Energy Related”  
Physicochemical Parameters

$$\log(1/C) = a\pi + \rho\sigma + \delta E_s + \dots + \text{constant}$$

C :  $EC_{50}$ ,  $LD_{50}$ ,  $I_{50}$ , etc. in Molar basis.

When an optimum value exists for certain parameters, parabola or bilinear model can be used.



# Process of the Emergence of Biological Activity (1)

When the **rate of emergence** is **slow** and the drug concentration in the transport and receptor-binding processes is **lower** than that (C) at the site of administration:

$$d(\text{Response})/dt = BKkC$$

**C** : concentration applied (almost unchanged)

**K** : “equilibrium” constant within transport process

**k** : the rate constant of the rate-determining step

**B** : proportional factor

# Process of the Emergence of Biological Activity (2)

When the **rate of transport** is **quick** and the drug concentrations at the site of administration and the “receptor” is in **a state of (pseudo)equilibrium** :

$$\text{Response} = BKC$$

**C** : “equilibrium” concentration

**K** : “equilibrium” constant

**B** : proportional factor

## Biological Endpoint as $I_{50}$ , $LD_{50}$ , $EC_{50}$ , MIC, etc.

Defined as the “concentration” inducing a **constant response** a certain time after the onset of the activity test.

For series of compounds:

$$d(\text{Response})/dt = BKkC = \text{constant}$$

$$\text{Response} = BKC = \text{constant}$$

$$BK'C = \text{constant} \quad (K' = K \text{ or } Kk)$$

$$\text{Log } (1/C) = \text{log } K' + \text{constant}$$

**Log  $K'$**  : Linear combination of terms attributed to effects of electronic, steric, hydrophobic, etc.

# Early Trials of the Quantitative Approach (1)

## “Narcotic” Activity of Tadpoles (Meyer, Hemmi 1935)

“Narcotic” : Paralyzation without Motion

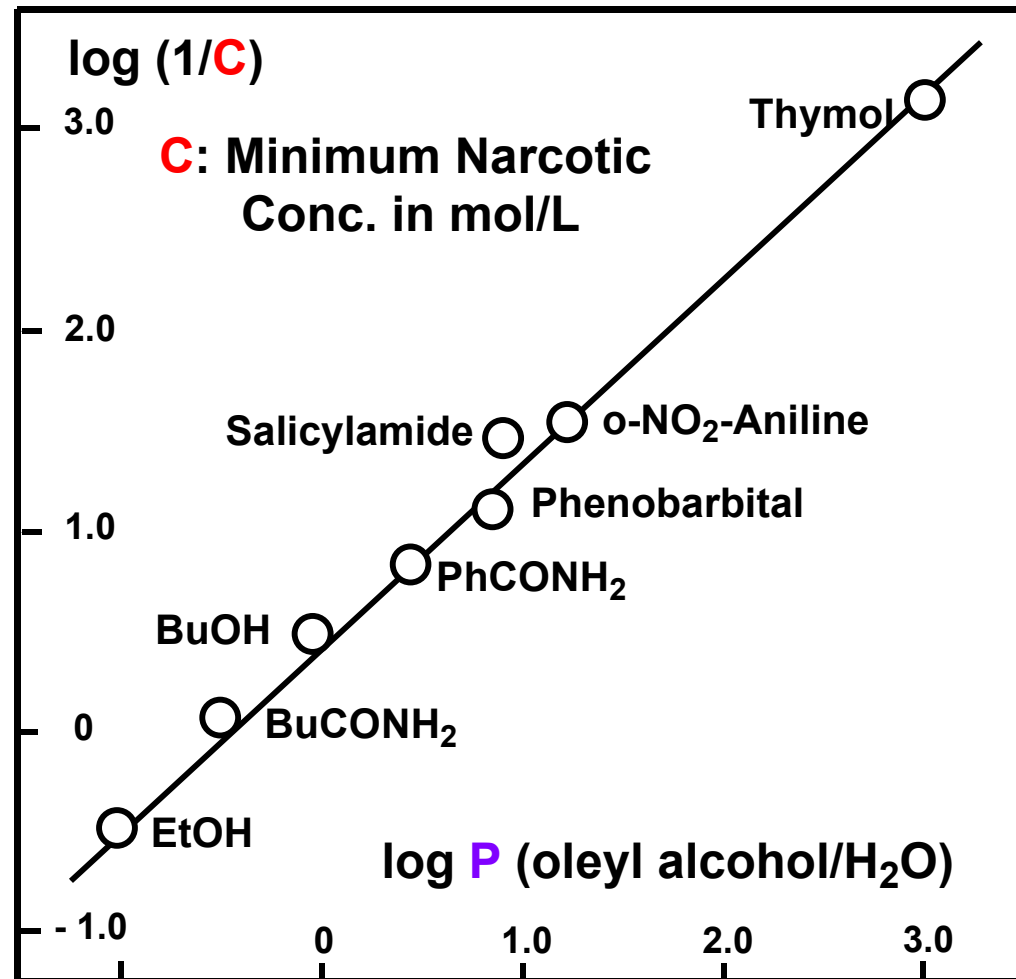
Nonspecific  
Toxicity of  
Miscellaneous  
Compounds:

$$C \times P = \text{constant}$$



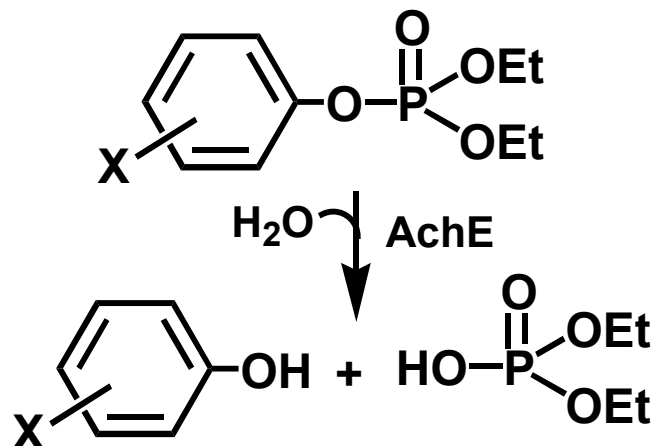
$$\log(1/C) = \log P + \text{constant'}$$

Slope of  $\log P \approx 1.0$



# Early Trials of the Quantitative Approach (2)

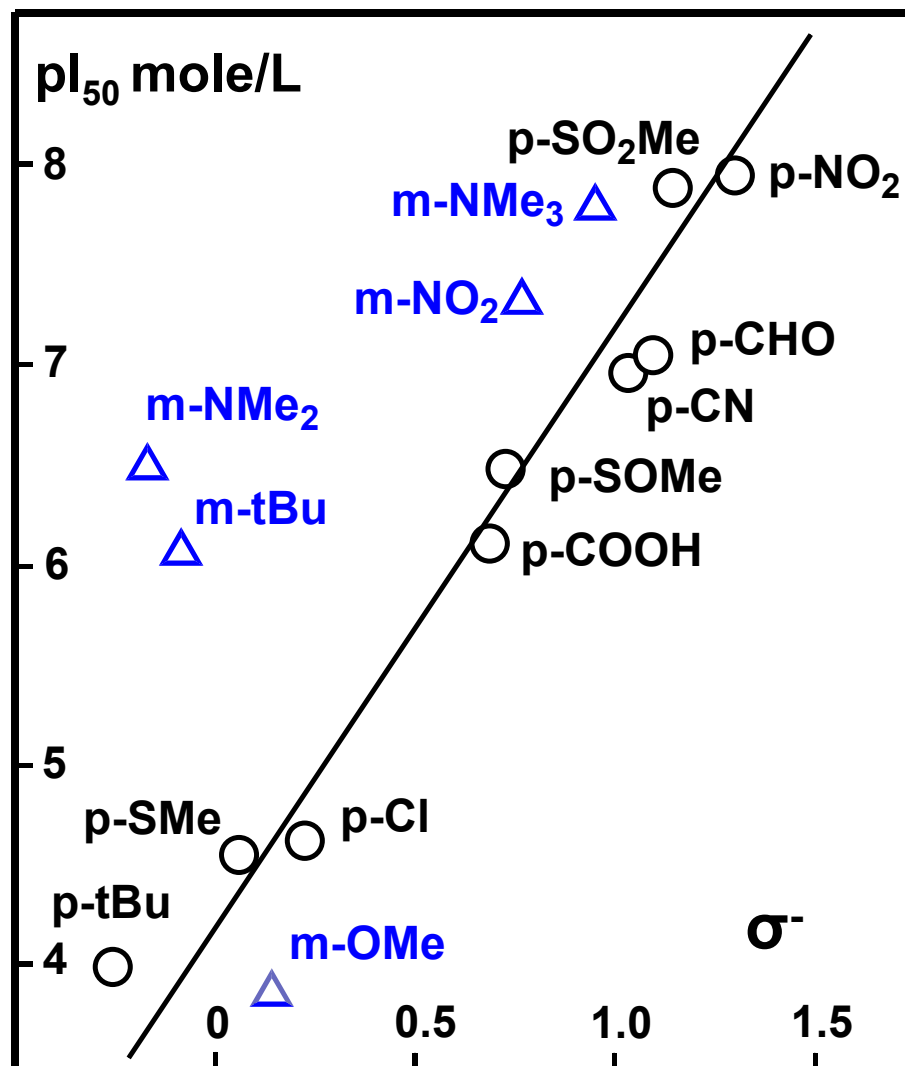
## Anti-ACh-Esterase Activity of Phenyl Diethyl Phosphates



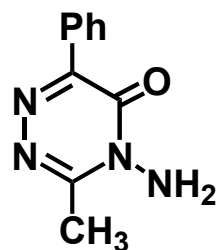
Effect of Para Substituents:  
Linear to  $\sigma^-$  Parameter

Effect of **Meta** Substituents:  
Participation of Others

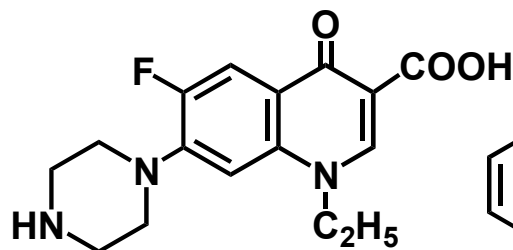
Fukuto and Metcalf (1956)



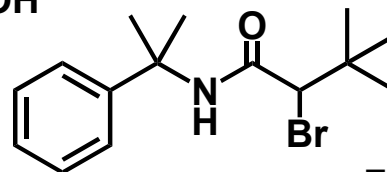
# Commercialized Drugs developed with the Aid of Classical QSAR



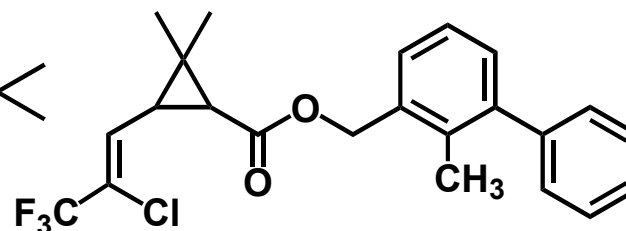
**Metamitron**  
(Sugar-beet  
Herbicide)  
Bayer 1975



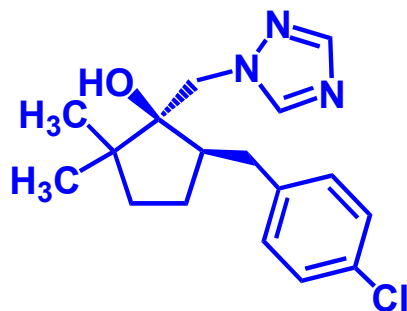
**Norfloxacin**  
(Antibacterial)  
Kyorin 1983



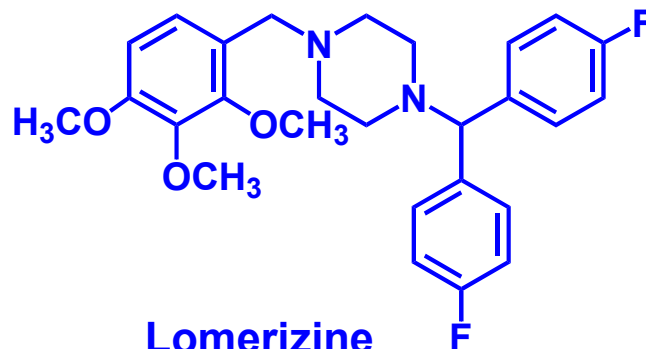
**Bromobutide**  
(Paddy Field  
Herbicide)  
Sumitomo 1984



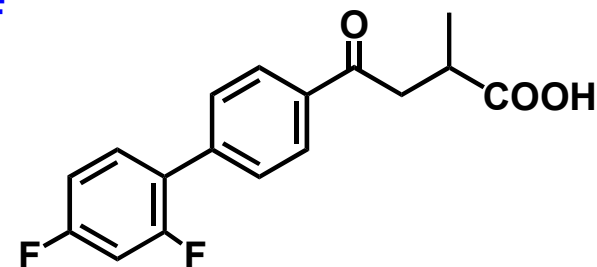
**Bifenthrin**  
(Foliar Insecticide)  
FMC 1984



**Metconazole**  
(Wheat Fungicide)  
Kureha 1994



**Lomerizine**  
(Antimigrane, Antiglaucoma)  
Organon Japan-Upjohn 1999



**Flobufen**  
(Long-acting Antiinflammatory)  
Kuchar et al.-Virbac 2000