## Qualitative Calculus and Qualitative Physics: Theory & Application

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#### **References**

- Mac Carthy & Pat Hayes, 1969
- Pat Hayes The Naive Physics Manifesto 1977
- Pat Hayes The Second Naive Physics Manifesto 1983

Artificial Intelligence Vol. 24, December 1984:

- De Kleer & Brown A Qualitative Physics Based on Confluences
- De Kleer How Circuits Work
- Forbus Qualitative Process Theory
- Kuipers Qualitative Simulation
- Williams A Qualitative Analysis of MOS Circuits
- Iwasaki & Simon

*Theories of Causal Ordering* **1986** 

#### Qualitative Physics Workshop Urbana-Champaign (Illinois), May 1987

#### Second Qualitative Physics Workshop

Qualitative Calculus...

#### Paris, July 1988

AAAI 88: ~ 25 papers

#### **MODELS**

#### <u>Signs</u>

- Introduced by the Economists (Samuelson 1947,Lancaster 1962)
- Used in Qualitative Physics under various formalisms
- Used in Control Theory (Travé 1986-1988)

#### **Orders of magnitude**

- Raiman AAAI 1986
- Dan Weld's Exaggeration

#### **PROBLEMS**

- "Comparative statics" = Linear equations
- Qualitative dynamics = Differential equations







The pressurizer of a nuclear power plant



#### <u>Heating a saucepan</u>



A simple oscillator

Confluence or Qualitative Equation

X = [dX] = sign of dX or DX, i.e.

• Sign of the variation dX of X during an infinitely small time interval.

• Sign of the variation **DX** of **X** between two distinct states.

?X is called a *qualitative derivative* 

<u>Remark</u>: In general, we work under the *quasi-static assumption*, i.e. In any transformation, a system passes through an infinite number of infinitely close equilibrium states.

#### [dP] + [dV] - [dn] - [dT] ~ 0

[dP]=+, [dV]=0, [dn]=-, [dT]=- does not satisfy the confluence

[dP]=+, [dV]=0, [dn]=- ==> [dT]=+

[dP]=+, [dV]=+ ==> the confluence is satisfied

A confluence is a necessary condition which must be satisfied by the signs of the physical quantities it involves

## A Qualitative Calculus Based on Signs

 $S = \{ +, 0, -, ? \}$ 

Addition and multiplication:

+	0	+	-	- :
0	0	÷		- :
+	+	÷		? :
-	-	?		- :
·.	?	?		? :

*	0	+	-	- ?
0	0	0		) (
+	0	+		- ''
Ι	0	_	-	+ :
?	0	;		? :

Qualitative equality:

For all a, b belonging to S:



Two connected pipes

$$P_{A} - P_{B} - Q^{2} 0$$
 (1)

?PB - ?PC - ?Q~ 0 (2)



?P <sub>1</sub> -?P <sub>2</sub> -?Q	~	0	(1)
?P <sub>2</sub> -?P <sub>3</sub> -?Q +?A	~	0	(2)
?P3 -?P4 -?Q	~	0	(3)
?P4 -?P5 -?Q	~	0	(4)
?P4 +?A			~ 0 (5)



Con 
$$= B_{11} + B_{12}^{*}(W_1+W_2) + B_{13}^{*}Profit + B_{14}^{*}Profit(-1)$$
  
 $W_1 = K^{*}W_1(-1) + B_{21} + B_{22}(Income+Tax-W_2) + B_{23}^{*}(Income+Tax-W_2)(-1) + B_{24}^{*}Time$   
Income  $= Con + Invest + Gov - Tax$   
Profit  $= Income - W_1 - W_2$ 

when

= Domestic consumption
= Public expenditures
= Gross domestic product
= Investments
= Profit
= Tax
= Private sector wages
= Public sector wages

B<sub>ij</sub>, K > 0 X(-1) = X(Time-1) What is the effect of an increase or a decrease in the "governmental variables" (Gov,Invest,Tax,W<sub>2</sub>)?

 Replace Income by Con+Invest+Gov-Tax and Profit by Con+Invest+Gov-Tax-W<sub>1</sub>-W<sub>2</sub>
 Consider ?Con and ?W<sub>1</sub> caused by {?Gov,?Invest,?Tax,?W<sub>2</sub>}.

-A.? $W_1 + C_{11}$ .?Con = A.? $W_2 + B_{13}$ .?Gov -  $B_{13}$ .?Tax + B<sub>13</sub>.?Invest ? $W_1 - B_{22}$ .?Con = - $B_{22}$ .? $W_2 + B_{22}$ .?Gov + B<sub>22</sub>.?Invest

(Here C<sub>11</sub>=1-B<sub>13</sub> and A=B<sub>12</sub>-B<sub>13</sub>)

## If one denotes ?X=sign(?X), a=sign(A), and if one assumes C<sub>11</sub>>0:

-a.?W<sub>1</sub> + ?Con<sup>~</sup> a.?W<sub>2</sub> + ?Gov - ?Tax + ?Invest(1) ?W<sub>1</sub> - ?Con<sup>~</sup> -?W<sub>2</sub> + ?Gov + ?Invest (2)

For example, if a=and if ?Tax=+ and ?Gov=?W2=?Invest=0 then ?W1=- and ?Con=-

## **Qualitative Linear Systems**

• QLS = A qualitative linear system *not involving a quantity and one of its derivatives at the same time* (otherwise, one gets a *Qualitative Linear Differential System*).

Solving a QLS
 AX ~ B

consists of finding vectors X without any ? component

• Let  $X_0$  be a solution of a QLS AX  $\sim$  B. Then, for any real vector  $X'_0$  with the sign pattern of  $X_0$ , there is a matrix A' and a vector B' with the sign patterns of A and B such that  $A'X'_0 = B'$ .

• In practical terms, QLSs stem from:

? A set of real equations (possibly nonlinear)

? A real differential system (comparative statics).

? A set of graphical constraints

### Hard components

For a real linear system:
? There is no solution
? There is a single solution
? There is an infinite number of solutions.
--> The unicity problem is stated in terms of a global solution vector.

• For example, assume that a=- and ?Gov=+:

?W <sub>1</sub> + ?Con	~	+	(1)
?W <sub>1</sub> - ?Con	~	+	(2)

Then ?W<sub>1</sub>=+, but ?Con remains ambiguous.

- In a QLS, a component:
  - 1) is a hard component
  - 2) has solutions + and -, but not 0
  - 3) has solutions +, 0 and -.

*Example of case 2: if* a=+ and if all the input variables remain steady, one gets:

-?W<sub>1</sub> + ?Con ~ 0 (1) ?W<sub>1</sub> - ?Con ~ 0 (2) and the solution set is ?W<sub>1</sub>=?Con=±

## **Qualitative Rank**

• Independant qualitative vectors: Let  $V_{1,...,V_{n}}$ be some qualitative vectors of the same size. We say that they are independant iff for any  $a_{1,...,a_{n}}$  all different from ?, the relation  $a_{1}V_{1}+...+a_{n}V_{n}$  0 implies  $a_{1}=...=a_{n}=0$ .

• Qualitative rank:

? The <u>rank</u> of a qualitative matrix A is the maximum number of independant column vectors.

? A matrix A has full rank iff the QLS AX  $\sim$  0 has the single solution X=0.

? A QLS AX ~ B is stationary iff matrix A has full rank.

• <u>Qualitative rank and hard components</u>: Let AX ~ B be a QLS with a hard component x<sub>j</sub>. Then there is a subsystem with full rank involving x<sub>j</sub>.

## **Qualitative determinant**

• <u>Full rank and determinant</u>: A square matrix A is not a full rank matrix iff Det(A)<sup>~</sup> 0.

• <u>Qualitative Cramer's Formula</u>: Let AX ~ B be a non decomposable square QLS such that Det(A)?0. Let Aj/B be the matrix deduced from

A by substituting vector B for its  $j^{th}$  column. Then, for any  $a_j \hat{I}$  {+,0,-} such that

aj<sup>~</sup> Det(A).Det(Aj/B),

there exists a solution vector X such that its  $j^{th}$  component  $x_j=a_j$ .

(A square matrix A is non decomposable if it cannot be matched by permuting its rows and columns to the form:

$$\begin{bmatrix} A & 0 \\ 1 \\ B & A \\ & 2 \end{bmatrix}$$

when A<sub>1</sub> and A<sub>2</sub> are square matrices)

## **Soft Components**

• Several algorithms have been proposed to solve this problem

- ? De Kleer & Brown, 1984
- ? Travé & Kaskurewicz, 1986

• But the structure of the solution set has not been yet investigated.

### The Qualitative Resolution Rule

In a practical way:

- x stands for a quantity
- (1) and (2) are two confluences
- y and z are two expressions not involving

the same variable with opposite coefficients

#### "One can eliminate a variable by adding or subtracting two confluences, provided that no other variable is eliminated at the same time."

#### Example:

#### Adding the two equations:

?W <sub>1</sub> +	?Con	~ -?W <sub>2</sub> ·	+ ?Gov - ?Tax	( + ?Invest	(1)
?W <sub>1</sub> -	?Con	~ -?W2	+ ?Gov	+ ?Invest	(2)
?W <sub>1</sub>	~	-?W <sub>2</sub> + ?G	 ov - ?Tax + ?l	nvest (3)	

#### Subtracting the two equations:

?W <sub>1</sub> + ?Con	~	-?W <sub>2</sub> + ?Gov - ?T	ax + ?Invest	(1)
?W <sub>1</sub> - ?Con	~	-?W <sub>2</sub> + ?Gov	+ ?Invest	(2)
?Con	~	??W <sub>2</sub> +??Gov - ?	'Tax +??Invest	(4)

?W1 is a hard component iff
 -?W2 + ?Gov - ?Tax + ?Invest ? ?

?Con is a hard component iff ?W2 = ?Gov = ?Invest = 0



Two connected pipes

?P<sub>A</sub> -?P<sub>B</sub> -?Q<sup>~</sup> 0 (1)

?PB - ?PC - ?Q~ 0 (2)

?PA - ?PC - ?Q~ 0 (3)



## ŽPA - ŽPC - ŽQ - 0 (3)=(1)+(2)

Þ



# Consequences for a Simulation Task

Suppose that ?PA=+ ?PC=+

Global relations + propagation rules:

ŽPB - Ž<u>PA + ŽPC</u> + + + +

ŽQ - ŽPA - ŽPC Ž<del>Q rem</del>ains + - + amb iguous

Initial model + propagation rules:

<u>ŽPA -</u> ŽPB - ŽQ - 0 +	-	- ŽPB - ŽQ
ŽPB - <u>ŽPC - Ž</u> Q - 0	-	ŽPB - ŽQ - +

## **Assembling a System**



Second example:



?P <sub>1</sub> -?P <sub>2</sub> -?Q	~ 0 (1)
?P2 -?P3 -?Q +?A	~ 0 (2)
?P3 -?P4 -?Q	~ 0 (3)
?P4 -?P5 -?Q	~ 0 (4)
?P4 +?A	~ 0 (5)





The resolution rule is based on a physical interpretation: it combines local behavioral descriptions into more global ones.



Recursively applying the resolution rule eventually provides direct relations - called <u>assemblages</u> - linking the internal variables and some selected reference variables (e.g., the input variables)

Reference variables = input variables

?P2	~ ?P1 + ?P5	(SA <sub>1</sub> )
?P4	~ ?P1 + ?P5	(SA <sub>2</sub> )
<b>?A</b> ~	-?P <sub>1</sub> - ?P <sub>5</sub> (S/	43)
?Q ~	?P <sub>1</sub> - ?P <sub>5</sub> (SA <sub>4</sub> )	
?P3	~ ?P1 + ? ?P5	(SA5)

Reference variables = {?A,?Q}

?P1	~	-?A + ?Q
?P2	~	-?A + ?Q
?P3	~	-?A + ?Q
?P4~	-?A	
?P5	~	-?A - ?Q

Obtaining a task-oriented assemblage makes the corresponding simulation task straightforward.

## **Scanning the resolution rule**

#### **Proof**

<u>Quasi-transitivity of qualitative equality</u>: If a<sup>~</sup> b and b<sup>~</sup> c and <u>b??</u> then b<sup>~</sup> c

Compatibilit	y of addition and	qualitative
equality:		
a+b <sup>~</sup> c	is equivalent to	a ~ c - b

Proof:

Let  $x + E_1$  a and  $-x + E_2$  b be two confluences such that x is a variable and  $E_1$ and  $E_2$  are two linear expressions not involving the same variable with opposite coefficients.

Then  $E_3 \ a + b$  is a valid confluence, when  $E_3$  is the same expression as  $E_1+E_2$  but with no repeated variable.

+	?P <sub>2</sub> - ?P <sub>3</sub> - ?Q + ?A <sup>~</sup> 0 (2) ?P4 + ?A	~ 0 (5)
R		(6)=(2)+(5)
+	?P <sub>2</sub> - ?P <sub>3</sub> + ?P <sub>4</sub> - ?Q <sup>~</sup> 0 ?P <sub>3</sub> - ?P <sub>4</sub> - ?Q <sup>~</sup> 0 (3)	(6)
R	?P <sub>2</sub> - ?P <sub>4</sub> - ?Q ~ 0 (7)=(	6)+(3)

#### Performing (6) - (3) is impossible (this would eliminate two variables at the same time)

#### Completeness properties of the qualitative resolution rule

Definition of an assemblage:

Let C be a set of confluences, wj be selected reference variables and vj the remaining ones. A set of global laws A is called an assemblage for the reference variables wj iff for each assignment of the reference variables  $w_j=a_j$ , as soon as the model imposes the value bj to the internal variable vj, then the basic propagation rules can deduce vj~ bj from the assemblage.

(Consequently, if vj~?, then vj is not determinate)

<u>Completeness</u> = Obtaining an assemblage

Qualitative resolution is complete (at least, in the square case):

If A X ~ B is a square qualitative linear system (QLS) and if the j<sup>th</sup> component x<sub>j</sub> of X is determinate (and has the value a<sub>j</sub>), then the qualitative resolution rule finds out in a finite number of steps the equation x<sub>j</sub> ~ a<sub>j</sub>

The resolution rule always finds out an assemblage

The proof requires notions such as:

- qualitative determinant
- qualitative rank
- maximal matrices with full rank ...

The general resolution rule is needed for completeness

Ritschard's rule (1983):

Let  $x + E_1 \ a$  and  $-x + E_2 \ b$  be two confluences such that x is a variable and  $E_1$ and  $E_2$  are two linear expressions not involving the same variable with opposite coefficients. Assume that all the variables involved in  $E_2$  are also involved in  $E_1$ . Then  $E_3 \ a + b$  is a valid confluence, when  $E_3$  is the same expression as  $E_1+E_2$  but with no repeated variable. Moreover, if a + b = b, then substituting confluence ( $C_3$ ) for confluence ( $C_1$ ) provides an equivalent set of confluences.

Ritschard claimed a completeness result concerning this rule.

Counter-example:

y + z + t ~ 0 x - z + t ~ 0 x + y - t ~ 0 x - y + z ~ 0

### But ...

## Freely applying the qualitative resolution rule leads to combinatorial explosion.

#### Pressure regulator (5 equations) --> hundreds of different ways for the resolution rule to apply

#### How to control qualitative resolution ?





#### Joining two components



y must appear in a model of  $C_{12}$ , but x should not.

Composing behavioral descriptions of  $C_1$  and  $C_2$  into an equivalent model for  $C_{12}$  requires to eliminate the variables (like x) involved only in  $C_1$  and  $C_2$ .

## The joining rule

Let **E** be a set of confluences and x a variable involved in exactly two confluences. If the resolution rule applies to confluences  $E_1$  and  $E_2$  by eliminating variable x, and if x is exclusively involved in  $E_1$  and  $E_2$ , then choose this application.

An equivalent model (as far as variables different from x are concerned) is obtained by substituting confluence E<sub>12</sub> produced in this way for confluences E<sub>1</sub> and E<sub>2</sub>.

This rule can apply recursively: a variable y involved solely in  $E_1$ ,  $E_2$  and another confluence belongs to exactly two confluences after the joining rule has been fired.

## A mathematical justification

• The conclusion - substituting  $E_{12}$  for  $E_1$  and  $E_2$  provides an equivalent model - has been proved in the square case. Indeed, we proved that any piece of assemblage that can be drawn from the initial model can be drawn after the joining rule has been fired as well.

• We proved more *(negative part of the joining rule)*:

Let **E** be a non decomposable set of confluences, and x a variable involved in exactly two confluences E<sub>1</sub> and E<sub>2</sub>. If the resolution rule does not apply by eliminating x, then no piece of assemblage involving a variable different from x can be drawn from **E** 



## When can the joining rule fail?

Though working properly in various examples, the joining rule *is not* complete: there are sets of confluences that can be assembled but have *no* variable involved in *less than 3* confluences.

Example:

	У	+ Z	+ t	~	0
Χ		- Z	+ t	~	0
Χ	+ y		- t	~	0
X	- y	+ Z		~	u

can be assembled in

x~u y~-u z~u t~?u

## Signed maximal non decomposable canonical qualitative matrices

(SMNDQM)

Signed = Stationary (or determinant = + or -)

Maximal = The matrix becomes unsigned as soon as one replaces a 0 entry by a + or - entry.

Two matrices are equivalent iff they can be mapped on each other by composing the operators:

- exchanging two rows/two columns
- multiplying a row/a column by -
- transpose

One selects a *canonical* representative from a class of equivalent matrices.



#### Lancaster's matrices



Gorman's matrices

$$\begin{bmatrix} 0 & + & + & + \\ + & 0 & - & + \\ + & + & 0 & - \\ + & - & + & 0 \end{bmatrix}$$



## The six 5x5 signed maximal non decomposable qualitative matrices

## Implementation issues

**Basic machinery** 

Let **E**<sub>0</sub> be the set of confluences to be assembled.

<u>Choice, step i:</u> Select from **E** a variable x such that

• x is involved in exactly two equations of E<sub>i</sub>.

- x has not been yet selected at step i
- there is a variable different from x involved in **E** which has not been yet

assembled.

<u>Joining rule, step i:</u> Apply the resolution rule to x, E<sub>1</sub> and E<sub>2</sub>. Set  $E_{i+1} \leftarrow E_i - \{E_1, E_2\} \gg \{E_{12}\}$ 

Backtracking, step i: Make a new choice, step i, or go back to step i-1.

## Simplification rules (I)

#### Equality rule:

Let  $ax+by^{\sim} 0$  (e) be a confluence. Then x=-aby, and -aby can be substituted for x in all the confluences x belongs to.

Example:

?P4+?A~0 --> ?A=-?P4

and

## Simplification rules (II)

#### Ritschard's rule:

Let  $x+E_1$  a (C<sub>1</sub>) and  $-x+E_2$  b (C<sub>2</sub>) such that E<sub>1</sub> and E<sub>2</sub> have no variable with opposite coefficients in common. <u>Assume that all the</u> variables involved in E<sub>2</sub> are also involved in E<sub>1</sub> and that <u>a+b=b</u>. Then, E<sub>3</sub> a+b (C<sub>3</sub>) is a valid confluence, and substituting (C<sub>3</sub>) for (C<sub>1</sub>) provides an equivalent set of confluences.

Example:



## Simplification rules (III)

<u>Single-occurrence-elimination rule</u>: If a variable x occurs in a single confluence (e) involving at least two variables, then discard x and (e) until assembling is completed.

#### Example:

After previous application of Ritschard's rule, ?P3 occurs only in confluence (3). Hence ?P3 and (3) can be discarded.

## **Soft Components**

• Several algorithms have been proposed to solve this problem

- ? De Kleer & Brown, 1984
- ? Travé & Kaskurewicz, 1986

• But the structure of the solution set has not been yet investigated.

#### Non standard qualitative models: Orders of magnitude Raiman, 1986

• Let (I,+,=) be a totally ordered commutative group, and  $(e_i)_i \hat{\mathbf{1}}$  be some distinct objects.

• S\*= {+e<sub>i</sub>,-e<sub>i</sub>,?e<sub>i</sub>}iî | U {0} • s1e<sub>i</sub> + s2e<sub>j</sub> = s1e<sub>i</sub> if i>j s2e<sub>j</sub> if i<j (s1+s2)e<sub>i</sub> if i=j x + 0 = 0 + x = x • s1e<sub>i</sub> . s2e<sub>j</sub> = (s1.s2)e<sub>i+j</sub> x.0 = 0.x = 0 • s1e<sub>i</sub> ~ s2e<sub>j</sub> iff s1=? and i>j or s2=? and i<j or s1 ~ s2 and i=j

# The Qualitative Resolution Rule for Orders of Magnitude

Let x, y, z, a, b be in S<sup>\*</sup> such that  $x + y^{\sim} a$  (1)  $-x + z^{\sim} b$  (2) If <u>x has the pattern set and if s is different from</u> <u>7</u>, then  $y + z^{\sim} a + b$  (3)

## Interval algebras

 Consider (E,<sup>^</sup>). One defines <sup>^</sup> on P(E) by A<sup>^</sup> B = {a<sup>^</sup> b; aÎ A and bÎ B}

• This enables us to define + and \* on the set of the real intervals I. One defines  $\tilde{}$  on I by  $I \tilde{} J = I I$ 

• If one considers a subset J of I, one defines I^ JJ = Min{KÎ J; K I^ J}

provided that this exists.

• (S,+,\*,~) is an interval algebra with + = ]0,+8 [ - = ]-8,0[ ? = ]-8,+8 [ 0 = [0,0]

• But, an interval algebra often has awful properties (the addition may be not associative).

### The Qualitative Resolution Rule for Interval Algebras

• Let (J,+J,\*J,~) be an interval algebra, and let x, y, z, a, b be elements of J such that x + y ~ a (1) -x + z ~ b (2) Suppose that J is stable under intersection (i.e. that IIIF <u>x is minimal with respect to</u> <u>inclusion</u> (that is, there exists no x' belonging to J such that xEx' and x?x'), then y + z ~ a + b (3)

#### Other models Dubois & Prade, 1988

• One considers three objects S, M and L, which are intended to represent the intervals ]0,sm[, ]sm,ml[ and ]ml,+8[ (but the landmarks sm and ml are unknown).

• F = {Set of intervals generated by unioning and multiplying by - the intervals S, L and M} U {0}.

• One can define + in different ways, for instance

S + S = +

or

S + S = S U M

We choose the second definition if we know that 2sm < ml.

• In either case, there is a resolution rule. The condition on x is that it belongs to the set {0,S,M,L,-S,-M,-L} (i.e., is minimal with respect to inclusion).

## Why Resolution ?

Similar aspect:

Let X, Y, Z be propositional variables (and x, y, z their boolean equivalents) such that  $X \lor Y$  (x + y = 1)  $\neg X \lor Z$  (-x + y = 1) Then Y v Z (y + z = 1)

**Completeness properties**