

# ASSIP-T. A THEOREM PROVING MACHINE

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## ABSTRACT

An associative processor for theorem proving in first order logic is described. It is designed on the basis of the deduction plan method, introduced by Cox and Pietrzykowski. The main features of this method are the separation of unification from deduction and the incorporation of a method for intelligent backtracking. This kind of backtracking is based on a special unification procedure. An improved version of this unification procedure is given, which outputs a unification graph with constraints. In the case of a unification conflict, sufficient information for a directed backtracking step can be gained from the unification graph. According to the deduction plan method, the ASSIP-T memory consists of two parts, one for the deduction plan and the other for the unification graph. ASSIP-T can perform deduction and unification in parallel. Both memory parts consist of a set of subparts each of which keeps the information about clauses or terms, respectively. A subpart is a linear array of cells provided with a control unit and can be regarded as a subprocessor.

## 1. In Production

The progress of microelectronics allows the realizations of more and more powerful processors for special purposes. One such type of processors is the associative processor. Its associative memory allows content oriented parallel access to the data stored in it. This makes the associative processors well suited for pattern handling processes. In artificial intelligence e.g., most processes are pattern directed deductions. One of it is theorem proving. In this paper a model of an associative processor is described which is able to prove theorems of first order logic. It is designed on the basis of the deduction plan method, i.e. it incorporates a method for intelligent backtracking.

After some basic definitions in the second section, the deduction plan method is described. The special unification procedure used within this method follows. The output of this procedure is a unifica-

tion graph with constraints. In the case of a unification conflict, the unification graph gives sufficient information for a directed backtracking step. This is described in section 5. Then the structure of the ASSIP-T processor which is aimed to perform the deduction plan method is described. Section 7 gives the data structures which are to be mapped on the ASSIP-T memory. Finally, the representation of the data structures in the ASSIP-T memory is sketched.

## 2. Basic Definitions

A *labelled graph* is a triple  $G = (V(G), I(G), E(G))$  where  $V(G)$ ,  $I(G)$ , and  $E(G)$  are the sets of nodes, labels, and edges respectively. A *path* of length  $n$  in  $G$  is a sequence  $w = v_1, e_1, v_2, e_2, \dots, e_n, v_{n+1}$  ( $n \geq 0$ ) with  $v_j \in V(G)$  and  $e_j \in E(G)$ . If  $v_1 = v_{n+1}$ , the path is called *closed*.

A closed path which contains each inner node at most once is called a *cycle*.

Assume there are given disjoint alphabets of *variables*, *function symbols* and *predicate symbols*. Each function and predicate symbol has an arity. A *constant* is a 0-ary function symbol. An *expression* is a variable or a term. A *term* is a constant or a string of the form  $f(q_1, \dots, q_n)$ , where  $f$  is an  $n$ -ary function symbol ( $n \geq 1$ ) and  $q_1, \dots, q_n$  are expressions. An *atom* is a string of the form  $P(q_1, \dots, q_n)$ , where  $P$  is an  $n$ -ary predicate symbol ( $n \geq 0$ ) and  $q_1, \dots, q_n$  are expressions. If  $A$  is an atom, then  $A$  and  $\neg A$  are *literals*. A *clause* is a finite set of literals. The empty clause is denoted by  $\square$ .

A *constraint* is a set consisting of two expressions. A set of constraints is called a *constraint set*. If  $p$  and  $q$  are expressions (terms), then  $p$  is a *subexpression* (subterm) of  $q$  if  $p = q$  or  $q = f(q_1, \dots, q_n)$  and  $p$  is a subexpression (subterm) of one of the  $q_i$ . An expression (term)  $p$  is a *subexpression* (subterm) of a constraint set  $C$ , if there is a constraint  $\{q_1, q_2\}$  in  $C$  such that  $p$  is a subexpression (subterm) of  $q_1$  or of  $q_2$ . The set of all subexpressions (subterms) of  $C$  is denoted by  $SEXPR(C)$ .

A substitution is a finite set of pairs  $(v, q)$ , denoted by  $v/q$ , where  $v$  is a variable and  $q$  an expression and  $v \neq q$ . Application of a substitution  $\sigma = \{v_1/q_1, \dots, v_n/q_n\}$  to an expression or a literal  $p$  is the replacement of each occurrence of  $v_i$  in  $p$  by  $q_i$ , for all  $i = 1, \dots, n$ .  $\sigma$  is called a renaming if  $q_1, \dots, q_n$  are pairwise different variables and  $\{v_1, \dots, v_n\} \cap \{q_1, \dots, q_n\} = \emptyset$ . A clause  $cl_1$  is called a variant of a clause  $cl_2$  if  $cl_1$  and  $cl_2$  have no variables in common and there is a renaming  $\sigma$  such that  $cl_1 = \sigma cl_2$ . If  $E = \{p_1, \dots, p_m\}$  is a set of expressions then a substitution  $\sigma$  is called a unifier of  $E$ , if  $\sigma p_1 = \dots = \sigma p_m$ .  $E$  is then called unifiable.  $\sigma$  is called a most general unifier of  $E$  if for each unifier  $\tau$  there is a unifier  $\rho$  such that  $\tau = \sigma \cdot \rho$ .

Let  $C = \{c_1, \dots, c_n\}$  be a constraint set. The set  $BE(C)$  of Boolean expressions over  $C$  is defined by

1.  $0, 1, c_1, \dots, c_n \in BE(C)$ .
2. If  $B_1, B_2 \in BE(C)$ , then  $(B_1 \vee B_2)$ ,  $(B_1 \wedge B_2) \in BE(C)$ .
3.  $BE(C)$  contains no other elements.

### 3. Deduction Plans

The deduction plan method is a resolution based method, i.e. a refutation method. It starts with a set of clauses and tries to construct a "closed" and "correct" deduction plan. If it succeeds, the clause set is proved to be unsatisfiable. The central idea of the method is to separate deduction from unification. This allows the application of a special unification algorithm which, in the case of a unification conflict, not simply stops with failure, rather it yields information about the causes of unification conflicts, namely certain deduction steps, which then can be reset. In section 5 this way of processing is called "intelligent backtracking".

The nodes of the deduction plan are the input clauses and eventually variants of them. Two clauses can be connected by an edge if they contain literals with the same predicate symbol but different signs (negated or not negated). Therefore a (labelled) edge between two clauses  $cl$  and  $cl_2$  is a triple  $(cl_1(t, u, v), cl_2)$ ,

where  $u$  and  $v$  are literals in  $cl_1$  and  $cl_2$  respectively, satisfying the condition on their predicate symbols and negation signs,  $t$  is the type of the edge. There are two types of edges: SUB and RED. All edges are of type SUB except those referring backward to a clause which is already in use. If each literal in each clause included in the plan occurs in an edge, the deduction plan is closed. If the set

of pairs of terms arising from the pairing of literals by edges is unifiable, the deduction plan is correct. Cf. for this section (Cox and Pietrzykowski 1979) and (Cox and Pietrzykowski 1981).

### Definition

Let  $S$  be a set of input clauses and  $L = \cup cl$ . A deduction graph on  $S$  is a graph  $clCS$   $G = (V(G), I(G), E(G))$  which has the variants of  $S$  as node set  $V(G)$ ,  $I(G) \subseteq \{SUB, RED\} \times I \times I$ , with: if  $e = (cl_1, b, cl_2) \in E(G)$  then  $b = (t, u, v)$ ,  $u \in cl_1$ ,  $v \in cl_2$ .  $t$  is called the type of the edge  $e$ ,  $u$  the starting literal and  $v$  the target literal. A literal  $u$  of a clause  $cl$  is called key literal iff there is an incoming edge with type SUB and target literal  $u$ . Each literal  $u$  of a clause  $cl$  is called a sub problem iff it is not a key literal. A subproblem  $u \in cl$  is open iff there is no outgoing edge with starting literal  $u$ . A subproblem  $u$  is called closed iff it is not open.  $OS(G)$  is the set of open subproblems of a deduction graph  $G$ .  $G$  is called closed, iff  $OS(G) = \emptyset$ . A node  $cl$  is called predecessor of

a node  $cl_2$ , iff there is a path from  $cl$  to  $cl_2$ , which contains only edges of type SUB (SUB-path). If  $u$  is the starting literal of the first edge of a SUB-path from  $cl$  to  $cl_2$ , then  $u$  is called preceding literal of  $cl_2$  and  $cl_2$  is called successor of  $cl$ .

We omit the definition of the deduction plan here. It is a deduction graph which is constructed by a number of deduction steps, i.e. edge drawing steps, starting from a basic plan which consists of one node only.

### Example

$S = \{ \{P(x), Q(y), R(f(x, y))\}, \{ \neg P(g(x)), V(x) \}, \{ \neg P(g(x)), \neg V(x) \}, \{ \neg Q(x), S(x), \neg T(x) \}, \{ \neg S(a) \}, \{ \neg S(b) \}, \{ T(b) \}, \{ \neg R(x) \} \}$

is a set of eight input clauses. Figure 1 shows a closed deduction plan for  $S$ . The edges are drawn in such a way that they begin beyond the starting literal and point to the target literal. Therefore they are only labelled by their type and, beyond it, by the numbers of the steps in the plan construction within which the edges were drawn. The literals  $\neg P(g(x_2))$ ,  $\neg V(x_3)$ ,  $\neg Q(x_4)$ ,  $\neg S(a)$ ,  $T(b)$ , and  $\neg R(x_5)$  are key literals, the other literals are subproblems. The first clause in  $S$  is the basic node, it is a predecessor

of all nodes.

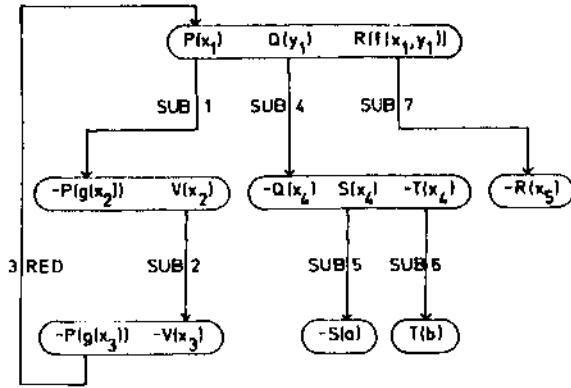


Figure 1: A closed deduction plan

**Definition**

Let  $G$  be a deduction plan and  $e$  an edge of  $G$  with label  $(t, u, v)$ , where (omitting the sign)  $u = P(u_1, \dots, u_n)$ ,  $v = P(v_1, \dots, v_n)$  ( $n \geq 0$ ). To  $e$  a constraint set  $C(e)$  is assigned by

$$C(e) = \{\{u_1, v_1\}, \dots, \{u_n, v_n\}\}$$

A constraint set  $C(G)$  is assigned to  $G$  by

$$C(G) = \bigcup_{e \in E(G)} C(e)$$

$G$  is called correct iff  $C(G)$  is unifiable.  $\theta(G)$  denotes the most general unifier of  $C(G)$ .  $\theta(G)os(G)$  is the clause derived from  $G$ . If  $G$  is closed, the clause derived from  $G$  is the empty clause.

Soundness and completeness of the deduction plan method are shown in the references given above.

**4. Unification Graphs With Constraints**

Unification by means of unification graphs with constraints is closely related to the unification method of Cox, (Cox 1981). It simplifies this method but is still sound and complete. Cf. for this section (Dilger and Janson 1983) and (Dilger and Janson 1984).

The unification process starts with a constraint set  $C$ . By two steps, the transformation step and the sorting step, it yields a unification graph with constraints,  $UwC$  for short, for  $C$ . A  $UwC$  consists of

- the node set  $V(UwC) = SEXPR(C)$
- the label set  $I(UwC) = 2^C$
- the edge set  $E(UwC) = EU(UwC) \cup ED(UwC)$   
 where  $EU(UwC) \subseteq V(UwC) \times \{2^C - \{\emptyset\}\} \times V(UwC)$   
 and  $ED(UwC) \subseteq V(UwC) \times \{\emptyset\} \times V(UwC)$

$EU(UwC)$  is a set of undirected edges,

$ED(UwC)$  a set of directed edges. Construction of  $UwC$  starts with the initial graph  $UwC_T$  which consists only of the nodes.

$EU(UwC)$  is determined in the transformation step,  $ED(UwC)$  in the sorting step.

**Definition**

A path in  $UwC$  which contains only edges from  $EU(UwC)$  is called a connection. A connection  $w = p_1, e_1, \dots, e_n, p_{n+1}$  is called simple iff  $p_i \neq p_j$  for all  $i, j$  ( $1 \leq i, j \leq n+1$ ).

A closed path in  $UwC$  which contains at least one edge from  $ED(UwC)$  is called a loop. A loop is called simple iff  $p_i \neq p_j$

for all  $i, j$  such that  $1 \leq i < j \leq n+1$ . If  $e = (p, a, q)$  is an edge in  $E(UwC)$ , then  $a$  is called the value of  $e$ , denoted  $val(e) = a$ . Let  $w = p_1, e_1, \dots, e_n, p_{n+1}$  be a path in  $UwC$ . Then the value of  $w$  is

$$val(w) = \bigcap_{i=1}^n val(e_i)$$

**The transformation step**

The algorithm of the transformation step can be found in (Dilger and Janson 1984). It draws undirected edges between the nodes in the following way: If  $e = \{p, q\}$  is a constraint, the nodes  $p$  and  $q$  are connected by the edge  $e = (p, \{e\}, q)$ . This results in a (possibly empty) set of new constraints, which are treated later on in the same way.

**Example**

Let  $C = \{c_1, c_2\}$  be a constraint set with

$$c_1 = \{G(s, z), G(u, F(y, y))\}$$

$$c_2 = \{u, F(y, G(s, z))\}$$

The initial  $UwC$  consists only of the nodes  $SEXPR(C)$  and is shown in figure 2. The first constraint  $c_1$  is removed, an appropriate undirected edge is added to the  $UwC$  and the new constraints  $\{s, u\}$  and  $\{z, F(y, y)\}$  are added to the constraint set.

Now the second constraint is removed from the constraint set. Because  $u$  is a variable, there cannot be formed any new constraints, only an edge is added to the  $UwC$ . The remaining two constraints are treated as the second one. Because they had their origin in the first constraint,

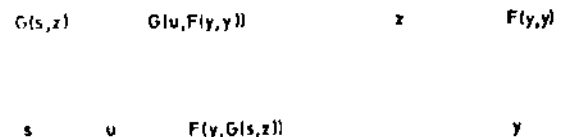


Figure 2: The initial  $UwC$  for the constraint set  $C$

the edges in the UWC are labelled by  $\{c\}$ . At the end of the transformation step the UWC has the form represented in figure J.

*The sorting step*

The transformation step classifies the nodes of UWC in such a way that two nodes belong to the same class iff there is a connection between them. In the example above we have four classes. In the sorting step, first a graph U is constructed which consists of these classes as nodes and which has a directed edge labelled by f from class X to class Y iff there is a term  $f(p_1, \dots, p_n)$  in X and an expression  $p_i$  ( $i \in \{1, \dots, n\}$ ) in Y.

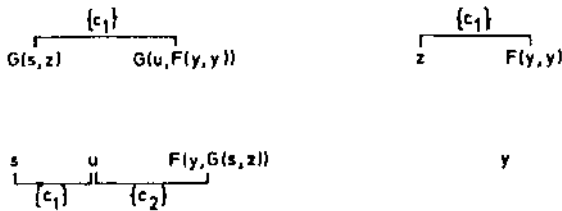


Figure 3: The UWC at the end of the transformation step

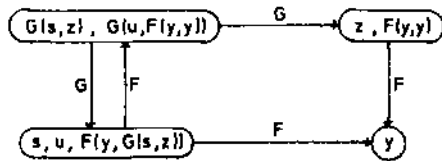


Figure 4: The graph U for the UWC

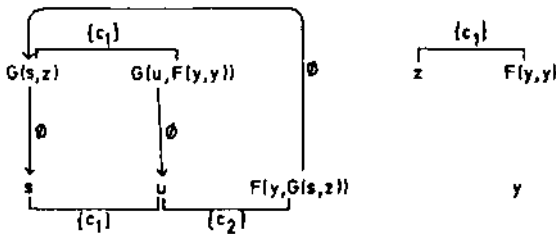


Figure 5: The complete UWC at the end of the sorting step

This graph is shown for the example in figure 4. Now the edges of U which belong to a cycle are added to the UWC as edges between the appropriate nodes and labelled

by 0. So we get the complete UWC of figure 5.

Soundness and completeness of the unification algorithm are proved in (Dilger and Janson 1984). The main theorem is: A constraint set C is unifiable iff all terms in UWC which are connected by a simple connection begin with the same function symbol and UWC contains no simple loop.

Thus, e.g., our example constraint set is not unifiable because the UWC of figure 5) contains a simple loop.

S. Intelligent Backtracking

If during the unification process a unification conflict has been detected, i.e. a clash (unification of terms with different function symbols) or a cycle, the actual deduction plan is not correct. One or several steps in the construction have to be reset in order to get a correct plan. By means of the information kept by the UWC these steps can be determined immediately. The numbers of the deduction steps are contained in the labels of the undirected edges of UWC. Therefore, we have to examine the values of certain paths through UWC. First, the relevant values are gathered in the sets ATTACH and LOOP.

ATTACH :=  $\{a \subseteq C \mid a \text{ is the value of a simple connection in UWC between terms } p \text{ and } q \text{ with different function symbols}\}$

LOOP :=  $\{a \subseteq C \mid a \text{ is the value of a simple loop in UWC}\}$

We define:

$$B_{ATTACH} := \prod_{a \in ATTACH} \sum_c c$$

$$B_{LOOP} := \prod_{a \in LOOP} \sum_c c$$

$$B_{UNIF} := B_{ATTACH} \wedge B_{LOOP}$$

The minimal disjunctive normal form of  $B_{UNIF}$  has the form

$$B'_{UNIF} = B_1 \vee \dots \vee B_k$$

for some  $k \geq 1$ , where each  $B_i$  is a conjunctive term. From  $B'_{UNIF}$  the minimal conflict sets are determined by

$$mcs_i := \bigcup_{\substack{c \text{ occurs} \\ \text{in } B_i}} \{c\} \quad (i = 1, \dots, k)$$

For details cf. (Dilger and Janson 1984).

Example

Consider the deduction plan of section 3, represented in figure 1. Following the edges according to their numbers we get the constraints

- 1:  $\{x_1, \neg(x_2)\}$
- 2:  $\{x_2, x_3\}$
- 3:  $\{g(x_3), x_1\}$
- 4:  $\{y_1, x_4\}$
- 5:  $\{x_4, a\}$
- 6:  $\{x_4, b\}$
- 7:  $\{f(x_1, y_1), x_5\}$

The UWC for these constraints is shown in figure 6. It has no directed edges, because the graph  $G$ , constructed in the sorting step, contains no cycles.

There is a clash in the UWC, namely a simple connection between a and b. Therefore,  $ATTACH = \{\{5,6\}\}$ . Clearly,  $LOOP = \emptyset$ . Thus,  $R_{ATTACH} = 5 \vee 6$ ,  $B_{LOOP} = 1$ ,  $B_{UNIF} = 5 \vee 6 = B_{UNIF}$  and  $mes_1 = \{5\}$ ,  $mes_2 = \{6\}$ .

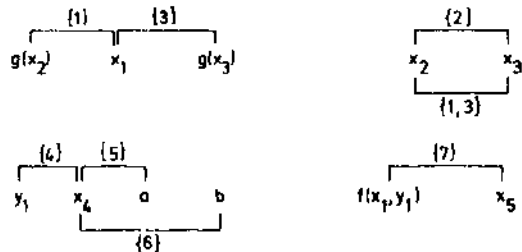


Figure 6: A complete UWC

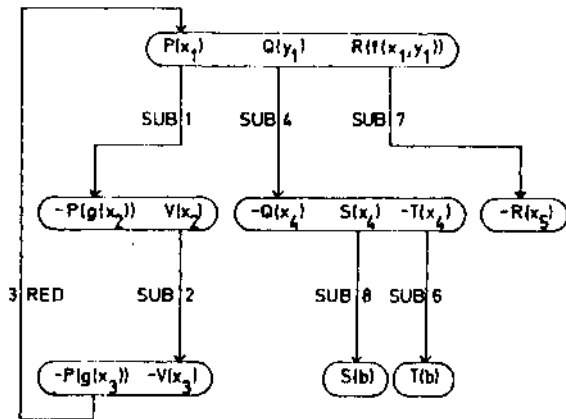


Figure 7: A closed correct deduction plan

Backtracking is performed as follows. Take for the backtracking step  $mes = \{5\}$ . Edge number fj and node  $-S(a)$  are removed from the plan. Thereby, the literal  $S(x)$  becomes an open subproblemi. But there

is another clause in the input clause set which fits so close the literal, namely  $\{-S(b)\}$ . This yields the closed correct deduction plan of figure 7. The reader is invited to check that backtracking with  $mes_2 = \{6\}$  does not result in a closed plan.

6. The structure Of ASSIP-T.

In the deduction plan method, deduction and unification are separated from each other. For deduction, the data structure "deduction plan" is used, for unification on the data structure "unification

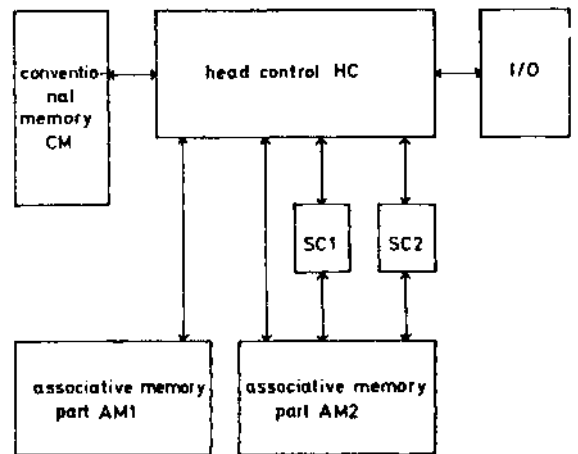


Figure 8: The structure of ASSIP-T

graph with constraints". In ASSIP-T, both are kept in appropriate parts of the associative memory. Thus, the associative memory is divided in two main parts, AM1 for the deduction plan and AM2 for the UWC, of figure 6. The control unit of the processor consists of 11 components:

- the head control HC
- two subcontrols SC1 and SC2
- a conventional memory CM

The subcontrols operate on the UWC. They can work independently from each other, but under control of HC, so they can work in parallel and this is useful during the initial construction of the UWC and during its reconstruction after a backtracking step. Thus, we have not only parallel access to the data in the associative memories, rather there are two further steps to parallel processing: one by the parallel treatment of deduc-

tion plan and UWC, the other by the use of SC1 and SC2 in parallel. For details cf. (Dilger and Schneider 1985). For an introduction to and a survey on the field of associative processors cf. (Fu and Ichikawa 1982), (Kohonen 1984), (Parhami 1973) and (You and Fung 1975).

### 7. Associative Memory Oriented Data Structures

Several data structures are used for an associative memory oriented representation of deduction plans and UWCs, i.e. representations that can easily be mapped on associative memories. The design principles for the data structures are:

1. Deduction plan and UWC - both being graphs - are taken as sets of nodes together with their edges.
2. A clause together with all its variants is represented as only one data object and therein their constant part is represented only once. The same holds for the terms of the UWC.

Due to lack of space we omit the data structures, which can be found in (Dilger and Schneider 1985), and only give some idea of them.

For each literal, we keep in its variants-part the edges to other literals, represented by the target literals and the edge labels, because in fact they are drawn between variants of clauses. This way of storing edges can be thought to be similar to the way they are drawn e.g. in figure 1.

The nodes of the UWC are variants of expressions. Therefore, we store all expressions which are variants of one another in the same part of AM2 (cf. section 8) together with the edges incident of them.

Because we build variants by just indexing the variables (cf. figure 1), we are able to represent the information "edge e is incident to node t" by simply storing the index of t's variables at e, too. Storing directed edges is done in a most efficient way, which just needs one bit for each argument of the respective term.

### 8. Representation And Handling Of The Data Structures In The ASSIP-T Memory

We will sketch here the representation of the UWC in the memory part AM2. It is similar for the deduction plan. AM2 is divided into several parts, one for each object of type EXPRESSION (that is, an expression, its variants and the edges incident to them). Every AM2-part consists of a linear array of cells and is provided with a special control, called

the "EXP-control". The entries in an object of type EXPRESSION can all be represented by the data types INTEGER and BOOLEAN. Therefore all cells of the AM2-parts have the same form. They consist of

- a logical unit
- a control bit
- a 4 bit flag register
- a 32 bit data register

cf. figure 9. The purpose of the flag register is to characterize the type of information which actually is stored in the data register, e.g. index and class of variants, information about edges etc. Thus, each cell can store an arbitrary part of an EXPRESSION.

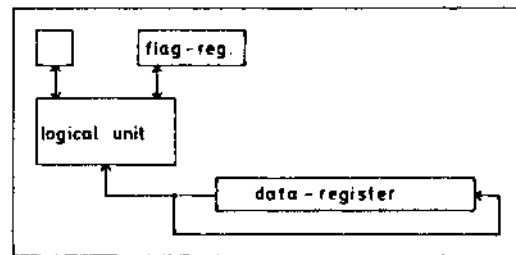


Figure 9: A subprocessor cell of ASSIP-T

The EXP-control has to perform entry, change and query instructions on the components of an object of type EXPRESSION. The head control on the other hand just has to broadcast information to the AM2-parts and to gather it from them by means of instructions like

"FOR\_ALL <expression> WITH <condition>  
DO <instruction>"

or "FOR\_ONE <expression> WITH <condition>  
DO <instruction>"

Thus, the two-level organisation of the ASSIP-T memory corresponds to a two-level evaluation of the instructions.

### 9. Conclusion

As far as we know there is no other approach similar to ours. The architecture of the fifth generation inference machine is data flow oriented and does not take into consideration associative access to data cf. (Moto-oka and Fuchi 1983). The main problem with our approach is the storage of the unification graph because its number of edges has an upper bound that is exponential with respect to the number of deduction steps. One may assume that this upper bound will never be reached

in practice, but we have to work out another representation of the edges. By means of several head control-subcontrol-groups, we should be able to perform OR-parallel as well as AND-parallel processing due to the separation of deduction and unification.

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