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An upper bound for the total number of options to implement an SDR multi-standard system

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Abstract—The design of future multi-standard systems is very challenging. Flexible architectures that exploit common aspects between the different set of standards cohabiting in the device offer promising solutions. In this paper, we adopt the theory of graphs and particularly the study of directed hypergraphs, which helps in providing a theoretical view of the graph structure of the multi-standard system. This graph description exhibits all the alternatives capable of implementing the system. On the other hand, we further provide in this paper an exponential upper bound for the total number of options which are capable of implementing a multi-standard design.

Index Terms—Directed hypergraphs, SDR multi-standard systems, cost function, exponential upper bound.

I. INTRODUCTION

Radio system designers focus their attention nowadays on developing flexible equipments that support a larger number of air interface standards in order to cope with the daily accelerating rate of technology innovation. The Software-defined Radio (SDR) concept [1] was emerging as a potential and efficient solution for making wireless networks highly adaptable and flexible. Design of SDR equipments is very challenging because it is very difficult to design a system that preserves most of the properties of the ideal software radio while being realizable with current-day technology. The fields of research that aim at solving or at least improving the methods and technologies implicated in the SDR area are numerous. Nevertheless, the SDR community is particularly driving the activities focusing on reconfiguration and reconfigurability [2] in a heterogeneous context [3].

The possibilities to design software radio architectures range from the “Velcro” approach to the “Very Fine Grain” approach. The former approach aims to support several communication standards through dedicated self-contained complex communication components, while the latter is based on manipulating small size operators to support different standards. However, a promising approach to realize an SDR multi-standard terminal is to identify the appropriate common functions and operators between and inside the standards. This is what’s called the “parametrization” approach [4]. This last approach aims at designing multi-standard systems made of certain operators (or functions) whose operations can be modified by a simple parameter adjustment. This approach can be extended to lower level entities called common operators [5]. It’s a very promising approach consisting of designing radio systems entities in a way that permits to take advantage of the programmable or at least reconfigurable capabilities of the underlying hardware of SDR systems.

In order to explore the different possibilities of an SDR design, it was necessary to describe the interrelationships between the different components in the system. Thus a graph structure representing the decomposition, into less and less complex operators, of each standard which has to be realized in the design was illustrated in [6], [7]. This graph representation provides all the options of implementation capable of realizing the multi-standard system for the designer, who can select the option that meets his demands. However, a cost function which calculates the cost of each of these options is introduced in [5]. This cost function combines both the flexibility and efficiency aspects. In this paper, we will exploit the theory of graphs in this context.

Graph theory is rapidly moving into the mainstream of mathematics mainly because of its diverse applications in different fields. Graph theory [8] is the study of graphs used to model pairwise relations between objects from a certain collection. A “graph” in this context refers to a collection of vertices and a collection of edges that connect pairs of vertices. A graph may be undirected, meaning that there is no distinction between the two vertices associated with each edge, or its edge may be directed from one vertex to another in which case it is called a digraph. Hypergraphs and directed hypergraphs [9] are generalizations of graphs and digraphs respectively.

Our final objective is to optimize the cost function to its minimum value possible and thus solving the optimization problem that finds balance between flexibility and computing efficiency. This will enable us to extract the most appropriate Common Operators (COs) from the most convenient granularity levels leading to the construction of an optimal SDR multi-standard design which takes advantage of the common aspects in use.

One issue towards solving our optimization problem is to try to explore the total number of options which are capable of implementing a multi-standard design, from which one with
A minimum cost is supposed to be extracted. In this paper, we detail this point and work on finding out an upper bound for the total number of the options of implementation of the multi-standard system.

The rest of this paper is organized as follows. After the present section, some basic definitions of directed hypergraphs essential for our work are reported as well as a theoretical description of the graph structure of the SDR multi-standard system as a directed hypergraph. Section 3 briefly introduces a cost function suggested in [5], which can calculate the cost of each possible option of implementation. In the subsequent section, an exponential upper bound for the total number of options which are capable of realizing the multi-standard design is derived. Finally, a conclusion’s section ends this paper.

II. REPRESENTATION FOR SDR SYSTEM IMPLEMENTATION USING GRAPH THEORY

In this section, we first explore a model for multi-standard systems as a graph with different levels of granularity which enables to select the convenient level depending on each designer’s needs. Then, we introduce some required definitions related to directed hypergraphs that will be key notations for the rest of this article. All this was indispensable in order to provide a theoretical representation of the graph structure of the multi-standard system as a directed hypergraph, which is finally presented in the section.

A. Graph modeling of SDR systems

An SDR multi-standard system is represented as a graph in [6]. To model such systems as a graph, it is necessary to distinguish between the different dependencies of the nodes of different levels. A node of a higher level, called a parent node, may have dependencies with nodes of underlying levels, called descendant nodes. An “OR” dependency (left part of fig. 1) means that only one of the descendant nodes (B or C) called several specific times is necessary to implement the parent node (A). However, an “AND” dependency (right part of fig. 1), signifies that all descendant nodes via the “AND” dependency (B & C) are needed to implement the parent node (A) accompanied with certain number of calls.

2. Each processing element (PE) occupies a certain layer depending upon its granularity level, where more complex PEs have higher granularity levels than less complex ones that can form their functionalities. Each node in the graph represents an elementary PE. In order to perform the functionalities of this PE, it can be installed by itself in the design, as a unified non divisible block, or it can be realized by some lower-level building blocks. The goal of this approach is to provide the options to the designer, to select a set of operators each of which occupies a certain level of granularity, as dictated by his needs.

A multi-standard reconfigurable system is modeled as a graph with several layers as shown in fig. 2. The roots of this graph, at the top level, represent the standards to be supported by the radio (Wifi and UMTS in the case of fig.

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Fig. 1. "OR" and "AND" dependency

Fig. 2. Global structure of a multi-standard graph (supporting Wifi and UMTS) - transmitter side, including the levels of the blocks on the right side of the figure
3) **Forward and Backward star [9]:** Let \( v \in V \). The Forward Star and the Backward Star of node \( v \) are defined by:

\[
FS(v) = \{ e_i \in E, v \in T(e_i) \} \quad \text{and} \quad BS(v) = \{ e_i \in E, v \in H(e_i) \}
\]

respectively.

Example In Fig. 3 we have:

\[
FS(x_3) = \{ e_2, e_3 \} \quad \text{and} \quad BS(x_3) = \{ e_1 \}.
\]

\[
FS(x_8) = \phi \quad \text{and} \quad BS(x_8) = \{ e_5, e_6 \}.
\]

4) **BF-reductions of hyperarcs [9]:** Let \( e = (T(e), H(e)) \) be a hyperarc in a directed hypergraph \( H \). A BF-reduction of \( e \) is a hyperarc \( \{(x_1), \{y_1\}\} \) where \( x \in T(e) \) and \( y \in H(e) \).

Example: we have \( \{(x_3), \{x_3\}\}, \{(x_3), \{x_6\}\}, \{(x_4), \{x_5\}\}, \{(x_4), \{x_6\}\} \) are all BF-reductions of the hyperarc \( E_3 \) in Fig. 3.

C. A mathematical model of the graph structure of the SDR multi-standard system

A theoretical representation of the graph structure presented in subsection II-A can be concluded. Formally speaking, the graph structure of a multi-standard system can be viewed as a directed hypergraph defined by the couple \( (V, E) \). The set of vertices \( V \) will include the blocks (functions and operators) present in the graph structure (example \( V = \{ \text{wifi}, \text{UMTS}, \text{randomizer}, \text{convolutional coder}, \ldots, \text{or} \} \) in the graph structure of Fig. 2) and a directed hyperedge \( e \in E \) will include the parent node as a tail node while all the necessary descendant node(s) capable of performing its task will form the head node(s) of \( e \). So this means that whenever we have an "AND" dependency, the hyperarc is formed such that the parent node is the tail node and all the descendant nodes via this "AND" dependency are its head nodes. Whereas when faced with an "OR" dependency, the hyperarc will have the parent node as the tail node and only one of its descendant nodes (if more than one exists) via the corresponding "OR" dependency will be the head node. In this way, we form the set of hyperarcs \( E \) including all the "OR" and "AND" dependencies present in the corresponding graph structure. For instance, we have \( \{ \text{randomizer}, \{ \text{Flip Flop, XOR} \} \} \) and \( \{ \text{interleaver}, \{ \text{LUT} \} \} \) belong to the set of hyperarcs \( E \) of the directed hypergraph of fig. 2.

III. THE COST FUNCTION

The graph structure of the multi-standard system (introduced in the previous section) provides all the options capable of implementing the standards to be supported. However, the cost function (CF) yields the cost imposed by any one of these options of implementation.

A. A Cost Function expression

Three key parameters enter the CF introduced in [6]:

- The **Building Cost** is the cost of the building PE capable of realizing a certain function. This cost is paid once independently of the number of times in which this PE is going to be called.
- The **Computational Cost** is considered to be the computing time required to perform a particular function. This cost has to be paid every time a PE is invoked or called by higher level PEs.
- The **Number of Calls** (NoCs) parameter stands for the number of times a processing element at a lower granularity level will be called to perform the task of the component at higher granularity level. A NoC is associated to every BF-reduction of every hyperarc.

We consider the following cost function:

\[
\sum_i BC_i . N_i + \sum_n \sum_k CC_k ((S_n)_{n \in \{1, 2, \ldots, N\}}).
\]

where:

- \( BC_i . N_i \) is the total BC of all the PEs that are present in the multi-standard system, where \( N_i \in \{0, 1\} \) depending on whether \( B^k \) is installed in the design or not.
- \( CC_k ((S_n)_{n \in \{1, 2, \ldots, N\}}) \) stands for the total CC imposed by one of the \( N \) standards, \( S_n \).
- \( \sum_k \sum_n CC_k ((S_n)_{n \in \{1, 2, \ldots, N\}}) \) is the total CC of all the \( N \) standards together.

An alternative theoretical expression of the above cost function can be found in [10].

B. An example for Cost Function derivation

In this subsection, we’ll explain the computation process of the just introduced cost function expression through an example. In Fig. 4, the numerical values under each node will represent the NoCs. For instance, the NoCs \( (\{ A \}, \{ D \}) \) on the BF-reduction \( (\{ A \}, \{ E \}) \) of the hyperarc \( (\{ A \}, \{ D, E, F \}) \) in fig. 4 will be expressed as \( w(\{ A \}, \{ E \}) = 7 \).

Note that there are cases in which we have the same BF-reduction via different hyperarcs, as in Fig. 4 for example, we have \( (\{ A \}, \{ D \}) \) is a BF-reduction of both \( E_2 \) and \( E_3 \). Thus, it was necessary to specify the weight of each by adding the index which is the hyperarc from which it was derived. For the sake of simplicity, the BF-reduction \( (\{ A \}, \{ D \}) \) will be abbreviated by \( (A, D) \). Consequently, we will write: \( w_{E_2}(A, D) = 20 \) in Fig. 4 and \( w_{E_3}(A, D) \).
As a first case, suppose that $S$ is going to be paid to realize the functionality of one A operator to install.

In the following, we will compute the implementation cost of the $S$ block at different levels of implementation.

As a first case, suppose that $S$ is going to be paid to realize the functionality of one A block using this option is:

$$CC(A)_{Using B,D,E} = CC(B) \times w_{E_2}(A,B) + CC(D) \times w_{E_2}(A,D) + CC(E) \times w_{E_2}(A,E)$$

$$= 1 \times 30 + 2 \times 20 + 10 \times 5$$

$$= 30 + 40 + 50$$

$$= 120.$$ 

Now since we need to call the tasks similar to the A tasks twice, then the CC that is going to be paid to realize $S$ from $B, D, & E$ operators will be:

$$CC(S)_{Using B,D,E} = CC(A)_{Using B,D,E} \times w_E(S,A)$$

$$= 120 \times 2$$

$$= 240.$$ 

The final total cost of this choice will be to add the total CC of $S$ (using $B, D, & E$) with the BC of each of $B, D, & E$ only once. So:

$$Cost(S)_{Using B,D,E} = CC(S)_{Using B,D,E} + BC(B) + BC(D) + BC(E) + BC(F)$$

$$= (2 \times 15 + 10 \times 7 + 10 \times 8) \times 2+ 10 + 20 + 15$$

$$= (30 + 70 + 80) \times 2 + 45$$

$$= 360 + 45$$

$$= 405.$$ 

Similarly, we’ll calculate the cost of realizing $S$ via $D, E,$ & $F$ ( again according to equation 1) and we’ll get:

$$Cost(S)_{Using D,E,F} = (CC(D) \times w_{E_3}(A,D) + CC(E) \times w_{E_3}(A,F)) \times w_{E_3}(S,A)$$

$$= (20 + 10 + 20 + 10 \times 5)$$

$$= 30 + 40 + 50$$

$$= 120.$$ 

Now since we need to call the tasks similar to the A tasks twice, then the CC that is going to be paid to realize $S$ from $B, D, & E$ operators will be:

$$CC(S)_{Using B,D,E} = CC(A)_{Using B,D,E} \times w_E(S,A)$$

$$= 120 \times 2$$

$$= 240.$$ 

The final total cost of this choice will be to add the total CC of $S$ (using $B, D, & E$) with the BC of each of $B, D, & E$ only once. So:

$$Cost(S)_{Using B,D,E} = CC(S)_{Using B,D,E} + BC(B) + BC(D) + BC(E) + BC(F)$$

$$= (2 \times 15 + 10 \times 7 + 10 \times 8) \times 2+ 10 + 20 + 15$$

$$= (30 + 70 + 80) \times 2 + 45$$

$$= 360 + 45$$

$$= 405.$$ 

The following summarizes all the attained costs to implement $S$:

$$Cost(S)_{Using S} = 480$$

$$Cost(S)_{Using A} = 90.$$ 

$$Cost(S)_{Using B,D,E} = 275.$$ 

$$Cost(S)_{Using D,E,F} = 405.$$ 

If for instance a designer seeks a least cost design to implement $S$, then he will be choosing the A operator to install inside the system because realizing $S$ using the A operator yielded a minimum cost (90).

As you can see in this example, there were four options able to realize the functionalities of the $S$ block. In the next section, our aim will be to provide a generalization for the total number of options capable of implementing the functionalities of the multi-standard system. In particular, we find an upper bound for this number, providing and explaining all the necessary derivations.

**IV. AN UPPER BOUND FOR THE NUMBER OF OPTIONS OF IMPLEMENTATION**

In this section, we will provide an exponential upper bound for the total number of options that are capable of implementing the multi-standard system. This is done by first introducing a computational cost vector $X_v$ on each vertex $v$ in the graph structure of the multi-standard system, whose dimension will represent the total number of options that can
realize block $v$. Then, we find an upper bound for $\text{dim}(X_v)$, thus achieving our goal.

Remark that one component in the $X_v$ vector will represent the total computational cost of an option which is capable of realizing the functionalities of block $v$, where this cost will be calculated with the aid of the cost function introduced in the previous section.

A. Introducing the computational cost vector $X_v$

We’ll associate a vector $X_v$ to each vertex $v$ in the directed hypergraph $H$ of a multi-standard system. Each entry of $X_v$ evaluates the total computational cost resulting from one particular choice of implementation chosen to realize block $v$. This vector will include all the possible implementations of $v$ and thus the dimension of $X_v$ will be exactly equal to the total number of options capable of realizing $v$.

For all the rest, we’ll denote the dimension of the vector $X_v$ by $|X_v|$, i.e. $|X_v| = \text{dim}(X_v)$.

The parameters that we need to form the entries of the $X_v$ vector are the BC, CC and the NoCs.

The vector $X_v$ is defined recursively from blocks of lowest levels up until those of highest ones. This means that first we have to find $X_v$ for all $v$ block in level 1, then $X_v$ for all $v$ block in level 2, $\cdots$.

First, for blocks $v$ in level 1, we have only one entry in $X_v$ (i.e. $|X_v| = 1$) because the only choice of implementation of such a block is by installing it by itself. This only entry in $X_v$ will be the CC of block $v$, because this will be the total CC in case where the block is installed by itself.

Having defined $X_v$ for all the blocks $v$ such that $l(v) \leq i$, we can find the vector $X_v$ where $l(v) = i + 1$ as follows:

- If we face an "or" hyperarc $e \in FS(v)$ (recall that an "or" hyperarc means that $|H(e)| = 1$) and suppose that $H(e) = \{r\}$ (so $e = \{T(e), H(e) = \{(v), \{r\})$), then this means that $v$ can be realized by $r$ associated with certain number of calls. Since $r$ can be implemented in $|X_r|$ ways, then this will impose $|X_v|$, choices capable of realizing $v$ by using $r$ because the total CC of any option that implements $r$, multiplied by the number of times $v$ calls $r$ (via $w(v, r)$), represents the total CC of an option that realizes $v$. Thus, any entry in $X_r$ multiplied by $w(v, r)$ will be an entry in $X_v$ describing the total CC of one of the options of implementation of $v$ via $r$.

- If an "and" hyperarc $e \in FS(v)$ is encountered, then $v$ will need the functionalities of all the blocks in $H(e)$ to be implemented. Suppose that $H(e) = \{s_1, s_2, \cdots, s_n\}$ (so $e = \{T(e), H(e) = \{(v), \{s_1, s_2, \cdots, s_n\})$). In this case, the calculation of the total computational cost of an option chosen to implement $v$ via this hyperarc $e$ will be:

choose one entry from each of $X_{s_{1k}}$, $k \in \{1, 2, \cdots, n\}$ (which represents the total CC of one of the options that can realize the functionalities of $s_{1k}$), multiply it by the number of times $v$ calls $s_{1k}$ (which is $w(v, s_{1k})$), and then add all the answers obtained for all $k \in \{1, 2, \cdots, n\}$. This will form an entry of $X_v$, because this is the way how the total CC of an option that can realize $v$ will be calculated when facing an "and" connection (as indicated in the previous section). Consequently, it’s obvious that this hyperarc imposes $|X_{s_1}| \times |X_{s_2}| \times \cdots \times |X_{s_n}|$ options capable of realizing $v$.

- One more option of implementation which is worth mentioning is characterized by using $v$ itself as a unified nondivisible block. This adds one more entry to the vector $X_v$ which is the CC of block $v$.

To make things clearer, we’ll start with a simple example and then introduce a generalization.

Fig. 5. two alternatives to implement $v_5$

1) Example: Fig. 5 shows an "or" $(e_1 = \{v_5\}, \{v_1\})$ and an "and" $(e_2 = \{v_5\}, \{v_2, v_3, v_4\})$ connection related to the implementation of block $v_5$.

Suppose that:

\[
X_{v_1} = (x_1, x_2, \cdots, x_m) \quad ; \quad |X_{v_1}| = m
\]

\[
X_{v_2} = (y_1, y_2, \cdots, y_n) \quad ; \quad |X_{v_2}| = n
\]

\[
X_{v_3} = (z_1, z_2, \cdots, z_p) \quad ; \quad |X_{v_3}| = p
\]

\[
X_{v_4} = (l_1, l_2, \cdots, l_q) \quad ; \quad |X_{v_4}| = q
\]

We’ll denote $Z_v$ by the set obtained from $X_v$ by just listing its components. So, for example, we have $Z_{v_1} = \{x_1, x_2, \cdots, x_m\}$, $Z_{v_2} = \{y_1, y_2, \cdots, y_n\}$, $\cdots$.

Set $U_{e_1} = Z_{v_1}$ (related to the "or" connection) and $U_{e_2} = Z_{v_2} \times Z_{v_3} \times Z_{v_4}$ (concerning the "and" connection).

In this case, $X_{v_5}$ will be a vector of dimension $m + n \times p \times q + 1$ where:

- The $m$ entries result from $U_{e_1}$ as follows:

$w(v_5, v_1) \times x_i \forall i = 1, \cdots, m$.

- The $n \times p \times q$ entries which result from $U_{e_2}$ are:

$w(v_5, v_2) \times a + w(v_5, v_3) \times b + w(v_5, v_4) \times c$\hspace{1cm} \forall (a, b, c) \in U_{e_2}$ (where $|U_{e_2}| = n \times p \times q$)

- The remaining entry is the result of the direct implementation of block $v_5$ itself. This entry, as mentioned before, is equal to the CC of block $v_5$.

2) Generalization: Let $H$ be a directed hypergraph of a multi-standard system. Let $v \in V(H)$.

The components of $X_v$ will be found as follows:

Let $e \in FS(v)$. Set

\[
U_e = \prod_{r \in H(e)} Z_r
\]
\[ \forall e \in FS(v), \forall a = (a_r)_{r \in H(e)} \in U_e \text{ we have:} \]
\[ \sum_{r \in H(e)} w(v, r)a_r \text{ is an entry in } X_v. \]

One more entry of \( X_v \) is the computational cost of \( v \) which, as mentioned previously, presents the direct installation of block \( v \).

**B. An upper bound for \(|X_v|\)**

1) **The dimension of \(|X_v|_i = |X_v|\)**: Based on what’s explained and discussed before in this section, we can easily conclude that:
\[ |X_v| = \sum_{e \in FS(v)} \prod_{r \in H(e)} |Z_r| + 1 \quad (2) \]
defined recursively from lowest to highest levels.

For all the following, we’ll denote \( u_i \) by an upper bound for \(|X_v|_i\), where \( v \) occupies the \( i^{th} \) level i.e:
\[ \forall v / l(v) = i \quad |X_v| \leq u_i \]

An expression of \( u_i \) will be our desired upper bound. \( u_i \) will be, as well, defined recursively from lowest to highest levels.

The following two parameters will be used:
\[ M = \max_{v \in V(H)} (|FS(v)| + 1) \]
\[ r = \max_{e \in E(H)} (|H(e)|) \]

Taking into consideration equation 2, we obtain recursively the following:

\[ u_1 = 1 \text{ (obvious)} \]
\[ u_2 = M(u_1)^r = M \]
\[ u_3 = M(u_2)^r = M(M)^r = M^{r+1} \]
\[ u_4 = M(u_3)^r = M(M^{r+1})^r = M^{2+r+1} \ldots \]

So generally, we can express the recursive relation as follows:

\[ u_1 = 1, \quad u_{s+1} = M(u_s)^r \quad \forall s \geq 1 \quad (3) \]

Here is a brief explanation. Suppose that we want to find \( u_s \), which is an upper bound for the number of options that can realize \( v \) (equivalently represented by \(|X_v|\)), where \( l(v) = s \).

We consider the following remarks:

- We have a maximum of \( M - 1 \) hyperarcs such that \( v \) is the parent tail node (by the definition of \( M \)).
- Each one of these hyperarcs contains a maximum of \( r \) head nodes.
- The worst case is that all the \( r \) head nodes are in level \( s - 1 \), which will impose a larger upper bound.

We can easily conclude, from equation 2, that each one of these (maximum) \( M - 1 \) hyperarcs imposes a maximum of \((u_{s-1})^r\) options. And thus the \( M - 1 \) hyperarcs all together will yield a maximum of \((M - 1)(u_{s-1})^r\) options. It remains to add the last option of implementation characterized by using the block \( v \) by itself. So as a whole, we get a maximum of \((M - 1)(u_{s-1})^r + 1\) alternatives of implementation which is obviously less than \( M(u_{s-1})^r = u_s \) \((M \geq 1)\).

This recursive relation can be easily solved with a simple induction on \( s \) and we obtain: \( u_s = M^{1+r^{s-1}} \quad (4) \)

In this section, we have found an exponential upper bound, as function of the selected parameters \( M \) and \( r \), for the total number of options that can implement any PE in the design. Consequently, we can derive an upper bound for the total number of options of implementation of all the top level standards to be supported, and thus have explored the number of alternatives that can realize the multi-standard design.

**V. CONCLUSION**

After having theoretically described the graph structure of a multi-standard system as a directed hypergraph and introduced a cost function equation, we have provided an exponential upper bound for the total number of options which can implement the multi-standard system. This is an important step that might help in solving our optimization problem, which states to select the option capable of implementing the design and which has a minimum cost. This could be a clue towards discovering the complexity of this optimization problem, i.e whether it’s a polynomial (P) or Non-deterministic Polynomial (NP) problem, which is an issue to be addressed in the future. Moreover, trying to improve this upper bound by finding a smaller one might be a very beneficial aspect to be explored.

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