

# JARI MÄNTYNEVA AUTOMATED DESIGN SPACE EXPLORATION OF TRANS-PORT TRIGGERED ARCHITECTURES

Master of Science Thesis

Examiners: Prof. Tommi Mikkonen and Prof. Jarmo Takala Examiners and subject approved by Department Council 12th April 2006

#### **ABSTRACT**

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Application specific processors offer a great trade-off between cost and performance. They are far more energy inexpensive compared to fixed processor designs. However, the design of these processors is still a challenging and time consuming task. Selecting suitable configurations from a vast design space needs time, accuracy and good practices. Thereby automated design space exploration tool has great interest in designing application specific processors. It assists the designer to select the most suitable resources for a given applications. Automated exploration tool must give reliable results, so one corner stone of the design space exploration is fast but accurate cost estimation of processor architectures.

TTA-Based Codesing Environment (TCE) framework is a set of non-commercial software tools for designing application specific processors. Its purpose is to help designers to find the most optimal processor architecture for the application at hand. It uses transport triggered architectures (TTA) as a template. TTA is a modular and flexible architecture and thereby suitable for customization.

In this thesis, an automated design space explorer tool of Transport Triggered Architectures was developed for TCE framework. The purpose of the automated design space explorer is to find out the best architecture configuration for a given application set. The automated design space explorer uses the toolset offered by the framework to explore the design space and verify the functionality of the generated architectures. Results and cost statistics of the configurations are stored into a database for further examination. In addition of the example algorithm that was designed and implemented during this thesis new exploration algorithms can be designed and implemented as plugins for the core application. This makes the further implementation and adoption of new algorithms easy.

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Sovelluskohtaisesti räätälöidyt suorittimet tarjoavat hyvän kompromissin hinnan ja tehokkuuden väliltä. Ne ovat huomattavasti energiatehokkaampia verrattuna räätälöimättömiin yleiskäyttöisiin suorittimiin. Sovelluskohtaisten suorittimien suunnittelu on kuitenkin haastavaa ja aikaavievää. Sopivien konfiguraatioiden valitseminen laajasta suunnitteluavaruudesta vaatii aikaa, tarkkuutta ja hyviä käytäntöjä. Siksi automaattinen sunnitteluavaruutta läpikäyvällä työkalulla on suurta kiinnostusta sovelluskohtaisesti räätälöitävien suorittimien suunnittelussa. Se helpottaa suunnittelijaa valitsemaan sopivimmat resurssit tiettyä sovellusta varten. Automaattisen työkalun täytyy antaa luotettavia tuloksia, joten yksi suunnitteluavaruuden läpikäynnin peruskivistä onkin nopea mutta tarkka suoritinarkkitehtuurin kustannusten arviointi.

TTA-Based Codesing Environment (TCE) on kokoelma ei-kaupallisia ohjelmistotyö-kaluja sovelluskohtaisten suorittimien suunnitteluun. Sen tarkoitus on auttaa suunnittelijoita löytämään juuri tietylle sovellukselle sopivin suoritinarkkitehtuuri. TCE perustuu suoritinarkkitehtuuriin nimeltä "transport triggered architecture" (TTA). TTA on modulaarinen ja joustava arkkitehtuurimalli, joka ominaisuuksien puolesta soveltuu hyvin räätälöintiin.

Tässä diplomityössä on kehitetty automaattista TTA-suunnitteluavaruuden läpikäyntityökalua TCE-sovelluskehykseen. Automaattisen työkalun tarkoituksena on löytää sopivin arkkitehtuurikonfiguraatio halutuille sovelluksille. Automaattinen suunnitteluavaruuden läpikäyntitylkalu hyödyntää muita sovelluskehyksen työkaluja tutkimaan suunnitteluavaruutta ja todentamaan luotujen arkkitehtuurien toiminnallisuuden. Tulokset ja kustannustiedot konfiguraatioista tallennetaan tietokantaan myöhempää tutkiskelua varten. Esimerkkialgoritmin lisäksi, joka suunniteltiin ja toteutettiin osana tätä diplomityötä, uusia tutkimusalgoritmeja voidaan suunnitella ja toteuttaa pääsovelluksen lisäosiksi. Tämä tekee tulevien toteutusten ja algoritmien käyttöönoton helpoksi.

## **PREFACE**

This MSc thesis was completed in Department of Computer Systems of Tampere University of Tecnology (TUT) in 2006-2009.

I would like to thank Professor Jarmo Takala for giving me an opportunity to be a part of this interesting project and project team and giving me guides and improvement ideas to this thesis. I am also very pleased to Mr Pekka Jääskeläinen for giving support and advices to this thesis. I would like to thank all of the people in TCE project for making a great working team. Thanks goes also to Professor Tommi Mikkonen for giving me improvement proposals for this thesis.

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Tampere, July 14, 2009

Jari Mäntyneva

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# LIST OF ABBREVIATIONS

ADF Architecture Definition File

ASIC Application Specific Integrated Circuit

ASIP Application Specific Instruction Set Processor

CISC Complex Instruction Set Computer

CLI Command Line Interface

CU Control Unit

DCT Discrete Cosine Transform

DSDB Design Space Database

DSP Digital Signal Processor

FU Function Unit

GPP General Purpose Processor

GUI Graphical User Interface

HDB Hardware Database

HDL Hardware Description Language

IC Interconnection network

IDF Implementation Description File

ILP Instruction Level Parallelism

IU Immediate Unit

LLVM Low Level Virtual Machine

PIG Program Image Generator

ProDe Processor Designer

ProGe Processor Generator

RF Register File

RISC Reduced Instruction Set Computer

SQL Structured Query Language

TCE TTA-Based Codesign Environment

TTA Transport Triggered Architecture

VLIW Very Long Instruction Word

XML EXtensible Markup Language

#### 1. INTRODUCTION

High performance and energy efficiency play the main roles in the current embedded systems. Customizable processor architectures have taken an important role in embedded system designs where increasing time-to-market requirements and more demanding speed and other requirements are pushing designers to create more advanced designs in less time.

In a traditional off-the-shelf processor, resources are fixed. The processors are designed to execute most applications efficiently and therefore are good for multipurpose uses. They are cheap and easy to get. But they also have their disadvantages, i.e., they are not the most energy efficient solutions and therefore not the best options for mobile devices or other devices that should run with small energy. These general purpose processors (GPP) are not either the best choice to run specialized tasks.

In embedded systems, microprocessors have often specific needs like low cost, high performance or low power consumption. All of these requirements can not be achieved with traditional multipurpose microprocessor architectures. A processor architecture template, which can be tailored for certain application set, offers one solution. Transport Triggered Architectures (TTA) represent a customizable processor architecture template. It is an efficient platform for a specific set of applications at hand. TTA is a modular processor architecture which can be easily customized and is, therefore, great in designing application specific processors. TTA processors can be highly optimized to contain only needed resources that can efficiently execute the specified applications. When designing a processor for a given set of applications it is possible to optimize the efficiency of TTA processor beyond the general purpose processors. TTA combines flexibility, modularity and scalability and can be tailored in use of wide variety of applications for mobile devices and other consumer electronic applications to the needs of embedded systems designs i.e. image processing.

When dealing with highly customizable processor architectures the design plays an important role. Selecting resources for a processor is not a simple task. Each component consume power so no extra components are preferred and some components might be simply too expensive to use. Area-wise architecture design must often have minimal area and energy consumption but still have high performance 1. Introduction 2

to execute the applications. When creating the optimal processor there are many resource variations to be tested if one is better than the other. The functionality of each variation must be tested and evaluated with an enough accurate estimate of the energy consumption and speed. This design space exploration is very time consuming and needs constant awareness from the designer. Automating this task makes the whole design process faster.

In this thesis, a tool for the automated design space exploration of TTA the Explorer was implemented as a part of TTA-based Codesign Environment (TCE) toolset. The Explorer tries to create the optimal processor configuration which combines the processor's architectural components and implementations of each component by testing a great number of component variations of TTA. Each variation is simulated and cost estimated to ensure the functionality and comparability of the configurations.

This thesis contains six chapters. Chapter 2 introduces the term design space exploration of application specific processors. It covers how the task is carried out for TTA in TCE. Chapter 3 tells more about the framework in TCE for TTA exploration. In Chapter 4 an example exploration algorithm that was developed in this thesis is introduced and in Chapter 5 there is a collection of results made with this example algorithm. Finally Chapter 6 summarizes the thesis.

# 2. DESIGN SPACE EXPLORATION OF APPLICATION SPECIFIC PROCESSORS

This chapter provides an introduction to application specific processors and what is meant with their design space exploration. The latter part concentrates in introducing Transport Triggered Architectures (TTA) and how the design space exploration is expected to work there.

### 2.1 Application Specific Processors

Application specific instruction set processors (ASIP) are processor designs which are tailored for particular use. They are co-designed with the software that they should run. This way the processor's design can be most easily and efficiently tailored for the specified software. The instruction set which tells all the different native operations that the processor can operate can be optimized for the application set at hand. With optimization the energy consumption and the silicon area costs of the processor can be minimized and the processor can be used in such devices where size or energy consumption would restrict the use of GPP. Instruction set tailoring for specific application or a small set of applications sets the ASIP in between the flexibility of GPP and an application specific integrated circuit (ASIC) which is only capable of running the one program it is designed for. As an advantage against the ASIC the software code of ASIP can be changed a little where ASIC needs a whole new chip. This is handy when small fixes to the software or new features are added after the device is already been produced. Also in this way the ASIP design lies in between of the GPP and the ASIC designs. Every unnecessary instruction wastes time and, more importantly, power. Also unnecessary bit transfers consume energy. E.g. every 32x32-bit multiplication of quantities that would only require 20 bits of precision wastes time and more than 50% of the energy consumed in that computation compared to computation made with adequate amount of bits [1]. This gives the motivation to use ASIPs over the GPP, not spending resources.

Very long instruction word (VLIW) [2] processor architecture has been an attractive alternative, e.g., in the digital signal processor (DSP) applications. They are scalable, so more logical units can be added to give performance, and flexible, i.e., operations can be almost anything [3]. The general organization of VLIW architecture can be seen in Figure 2.1. The VLIW consists of instruction fetch, instruction

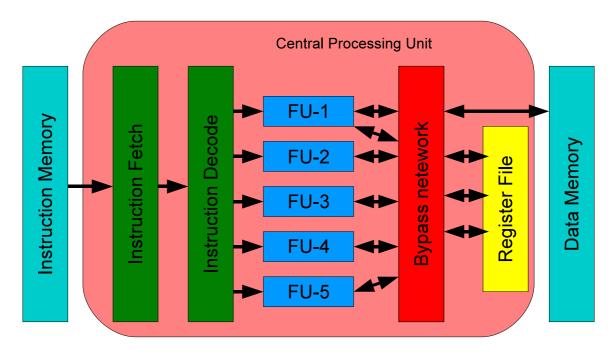


Figure 2.1: VLIW processor high-level organization.

decode units, parallel function units (FU) and a multi-ported register file (RF) which is shared by the FUs. The RF consist of many registers and the number of ports makes it complex and one of the bottlenecks of the design.

Instruction set parallelism (ILP), which is a measure of how many of the operations in a program code can be performed simultaneously, can be efficiently exploited in these kinds of processors like VLIW. In Figure 2.2 there is a simple example how ILP is generated. In the figure the operation on line 3 depends on the result of operations in lines 1 and 2, so it cannot be calculated until the both of them are completed. However, operations on lines 1 and 2 are not dependent of other operations, so they can be calculated simultaneously. If each of the operations can be completed in one unit of time then these three instructions can be completed in total of two time units. This gives an ILP of 3/2. A processor that executes all of the instructions one after another might be very inefficient whereas the exploit of ILP can give a huge burst in efficiency. The goal of compiler and processor designers is to find this kind of structures and take advantage of ILP as much as possible. The performance can be improved by executing different sub-steps of sequential instructions simultaneously or by executing multiple instructions completely simultaneously. In

1: 
$$e := a + b$$
  
2:  $f := c - d$ 

$$3: g := e * f$$

Figure 2.2: ILP example

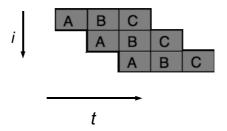


Figure 2.3: Pipelining.

Figure 2.3 is a simple example of a unit that implements a three-stage pipelining. In this kind of pipelining the execution of instruction is divided in three stages:

- Instruction fetch (A)
- Instruction decode and register fetch (B)
- Execute (C)

The idea of pipelining is to split the processing of an instruction into a series of independent steps. This increases the number of instructions that can be executed in a unit of time without the need of adding more processing units. One processing unit can prepare the executing of following instructions in advance at the same time it is processing the current instruction. A non-pipeline architecture is inefficient since more processor components are idle when another component is active during the instruction cycle. Pipelining decreases this idle time of components but does not remove it completely.

In Figure 2.3 number of instructions i grows downwards and time t grows to right. The different sub steps of operation execution can be utilized by using the three-stage pipelining which consists of three stages. These stages could include: instruction fetch, decode and execution. In instruction fetch phase, the instruction fetch unit fetches the next instruction from the memory. In the decode stage the instruction is decoded and data path is prepared for data transports and in the execute stage the instruction is executed. This is just an example and these steps may vary and there can also be more of these steps to give even more efficiency depending on the used architecture.

In graphics and scientific computing applications there can be much of ILP. Also applications from the field of digital communications and multimedia consumer electronics often spend most of their cycles executing a few time-critical code segments with well-defined characteristics, making them amenable to processor specialization.

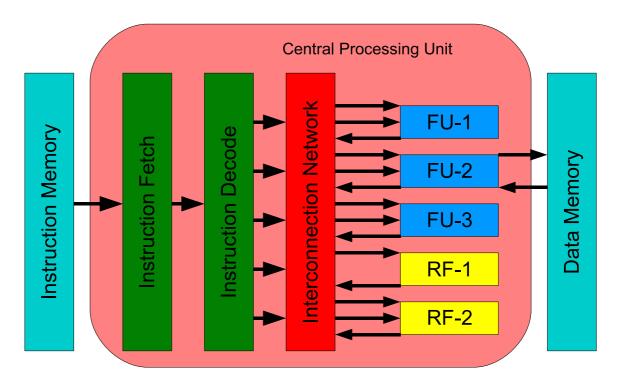


Figure 2.4: TTA processor high-level organization.

These computation-intensive components often exhibit a high degree of inherent parallelism, i.e., computations that can be executed concurrently. VLIW and similar ASIPs are particularly effective in exploiting such fine-grained ILP. [4]

The basic idea of VLIW is to determine the schedule of the program execution at the time of static scheduling. The scheduler needs to find out the interdependencies of the instructions and determine which operations can be executed simultaneously and by which part of the processor. In traditional processor architectures like CISC (Complex Instruction Set Computer) or RISC (Reduced Instruction Set Computer) the processed code is completely sequential and the processors themselves check which instructions can be executed simultaneously without changing the result. This needs logic and wastes power in these kind of processor architectures. Since in VLIW the execution order of the operations is determined already by the compiler, the processor itself does not need to contain the complex hardware to perform the runtime scheduling. As a result, VLIWs potentially offer significant computational power with less hardware complexity.

However, there are also drawbacks in the VLIW architecture. The length of one instruction is longer than in traditional processor architectures so the compiled code weights usually more. Longer instruction words lead to methods of instruction packing which correspondingly adds the complexity of the instruction decoder.

Transport Triggered Architectures (TTA) reminds VLIW. Figure 2.4 illustrates a high-level TTA architecture. In VLIW the FUs are always connected to a multi-

ported register file (RF), but in TTA there are multiple register files and they are connected to the interconnection network, not directly to the FUs. In TTA this gives a possibility of software bypassing where results of FUs are transported directly to another FU. This approach reduces especially the RF port bottleneck which creates data path complexity in VLIW when more FUs are added.

From the software aspect, the TTA approach is quite similar to VLIW but it gives even more responsibility for the compiler. Where program code for VLIW only describes which instructions can be executed simultaneously the TTA code tells also how the instructions are transferred internally between the registers and computational units. TTA reveals the internal buses and ports in the instruction set and these can be exploited by the compiler. This gives more power for controlling the internal connection needs and the number of connections between computational units can be reduced greatly. This makes possible for TTA processor to be smaller, faster and less energy consuming than similar purpose VLIW designed processor. Drawbacks of TTA are even longer instruction words than in VLIW. The drawbacks of longer instruction words can be decreased by different program compression techniques. In case of TTA the program is compressed during the compilation when the speed of compression is of little importance. However, the decompression must be performed during run-time, so it adds an overhead to the execution time. It has been shown that dictionary-based program compression is the most suitable compression method for TTA [5]. For more discussion of hardware and software aspects of the TTA see [6], [7] and [3].

# 2.2 TTA-Based Codesign Environment

MOVE framework was the first toolset for co-design TTA systems [8]. The framework development was started in Delft University in Netherlands and developed further with Tampere University of Technology. Further information of the project can be found in [9].

In 2002 at Department of Computer Systems of Tampere University of Technology was started a project aiming to build a new toolset with a controlled manner and expandability in mind. The project is called TTA-Based Codesign Environment (TCE). [10]

## 2.2.1 Inputs for TCE

The initial inputs for the TCE design flow are the C coded programs. The processor is designed for these input programs. Current front-end compiler of the TCE, tcecc, is LLVM (Low Level Virtual Machine) based front-end compiler which generates LLVM byte code from the C code. This byte code is the input of the TCE design

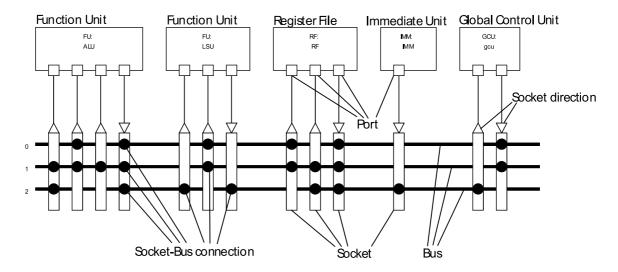


Figure 2.5: Simple TTA structure.

flow. For more information of the LLVM framework refer to [11].

## 2.2.2 Processor Architecture Template of TCE

The TTA processor architecture template consists of few base components. The TTA can be considered as a set of FUs, RFs, move buses and sockets. Buses and sockets form an interconnection network for the TTA that connects the FUs and RFs.

In TCE the architecture definitions are stored in a file called Architecture Definition File (ADF) [12]. ADF is a text file in EXtensive Markup Language (XML) format that contains description of the processor architecture. ADF contains identified components and parameters for the processor but it does not specify the internal implementations of the components.

Figure 2.5 is an example of a simple TTA processor supported by the TCE. The figure is an ADF file presented with ProDe tool of TCE. The different component types are described in the following.

Function Unit Function units contain the operations that the TTA processor can execute. One FU may contain any number of operations which creates the real functionality of the processor. These FU operations can be decided freely by the designer. TCE comes with a set of basic operations like addition and shifting that can be directly mapped to LLVM operations and used by the compiler. New operations can be created and added to custom operation sets by the designer. These custom operations may have potential use in cases when some specific operations are repeatedly used in same order. Then an customized operation containing functionality of these sequential operations can be created to reduce the data moves and execution time. Function unit

operations can also be pipelined to increase the potential clock frequency.

Data to and from a FU is transferred through ports. One of the FU ports is used to select which operation of the FU is used. A triggering port is one of the FU ports and it is used to start the executing of the selected operation. Values are stored in internal registers of the FU where they are read in time of execution and written as a result.

Some FUs in TTA processor have operations that can access memory, such as loading and storing values into the data memory. These FUs must specify the address space that is accessed by the FU. The address space defines a range of memory addresses that the FU can access. [12]

Register File Registers are used to store temporal data during the program execution. A register file can contain any number of registers. All the registers in a single RF have the same bit width which is not limited. Register files can have any number of input and output ports to write and read the data of the registers. RF having multiple input or output ports can be accessed multiple times within one clock cycle. [12]

Immediate Unit Immediate units (IU) are optional components that are used to transfer long immediates to the processor core. An IU is a special register file where registers contain long immediate values that are written by the control unit during instruction decoding. IU can contain only read ports since the registers are written by the control unit directly. [12]

Control Unit Control unit (CU) is a specialized FU that creates control signals for the interconnection network. It has functionality to fetch instructions from the instruction memory and decode them to produce the control signals. The CU usually have at least the operations call and jump which perform function calls and jumps in the program code being executed. [12]

## 2.2.3 Design Flow

Designing a processor for TCE follows a particular design flow which includes following phases: sequential LLVM byte code generation, design space exploration including configuration selection, parallel code generation and analysis and as a final phase program image and processor generation. In this thesis the term configuration holds two elements: architecture and implementation. The architecture consist of components that tell how the processor is built and what kinds of resources it holds. The implementation part combines the architectural components to the hardware descriptions how the different components are implemented. There can

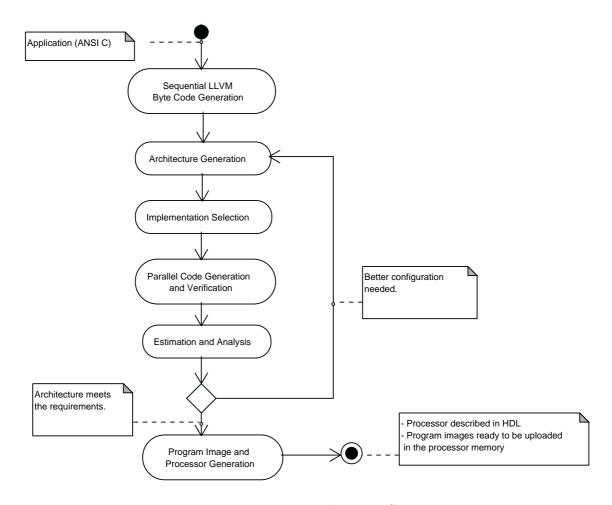


Figure 2.6: Design Flow in TCE.

be many variations of the implementations for each architecture component so the implementations must also be selected for each component. Figure 2.6 illustrates the design flow in the TCE.

**Sequential Code Generation** In order to start the design space exploration it is essential to have the target applications available. The processor is designed from the basis of the resource utilization of the programs. The application code can be written in high-level programming language such as C and it can be compiled as LLVM byte code with the TCE front-end compiler.

Design Space Exploration and Implementation Selection After the initial input code is generated, the target architecture is designed. This is done by exploring the design space by adding and removing components of the target architecture. Every component affects to costs of the processor so this phase is optimizing the architecture until the design meets the set requirements. Implementations for the architecture components are then selected from pre-created libraries. Complete

configurations are compiled and simulated for evaluating the configuration costs such as speed, silicon area and energy consumption. This phase is repeated until no better configuration is found. The simulator application of TCE toolset is described in [7] and developed further as a compiling simulator in [13].

Parallel Code Generation and Analysis The initial sequential LLVM byte code is scheduled and compiled as parallel code against the target processor configuration that is generated in the exploration process with *teecc* compiler. The result parallel TTA-program is then simulated with the processor configuration. With the results of simulation the program and the processor configuration are analyzed and evaluated for terms such as speed, silicon area and energy consumption. If the parallel code is not fast enough or the other processor requirements are not met, the previous phase is repeated to fix the configuration. This can be done multiple times when finding out the most affordable configuration before entering the final phase. The costs of the configuration can be measured in terms of silicon area, clock speed, execution time of energy consumption and some of them can be set as the criteria of the most suitable configuration.

**Program Image and Processor Generation** Finally the processor is generated by writing the fixed processor configuration details in a hardware description language. The hardware description language files are fetched for each building block from a database. This database can be reused in processor generation of same technology.

Also the final bit image of the program to be executed in the processor is generated during this final phase of design flow. For more information of the program image and processor generation process refer to [14].

## 2.2.4 TCE Tools And File Formats Related to Exploration

The current development version of TCE provides a complete set of tools that are needed for designing a TTA processor from the scratch. Some of the tools contain graphical user interface (GUI) but most provide only a command line interface (CLI). The tools are, however, designed in such a manner that GUIs may be added quite easily in the future, if needed. The file formats and tools of TCE that are used or produced by the exploration process are the following:

**LLVM Byte Code** The front-end compiler generates code from high level code to LLVM byte code. This byte code is not TTA-specified and can be compiled against any TTA architecture. This byte code is the initial input of the explorer.

Architecture Definition File ADF is a file containing architecture description of the processor. It is an input and output file of the design space exploration. ADF is a file in XML format that contains description of the processor architecture. ADF contains identified components and parameters for the processor. ADF defines also constraints of the architecture template. The ADF can be created and modified easily with a Processor Designer (ProDe) tool. It is a tool with GUI for modifying all the components of the ADFs. ProDe can be used for manual and partly manual design space exploration and also to visualize the architectures. ProDe is not a necessary tool in TCE or in automatic design space exploration but it is very useful tool because its good presentation of the processor and it provides user a simple interface to modify the ADF file.

Machine Implementation Description File Machine implementation description file (IDF) is a file that contains information of which component implementation is selected to implement an architecture component. It is an output and optional input file of the design space exploration. Implementations for architectures are stored in the IDF. IDF is an XML file which contains tags for function units, register files and other necessary data to give the information where the implementation details of each architectural component lies and with which it is possible to synthesize the processor. IDF does not directly tell the Hardware Description Language (HDL) file but it tells which entry of the Hardware Database file is used to implement each architecture component which finally tells the exact HDL description. Also IDFs for a ADF can be created and modified easily with ProDe tool.

Hardware Database (HDB) HDB is a database that contains all the necessary information of the building blocks needed by the tools of TCE. It consists of provided and user defined processor building blocks, such as function units, register files, sockets and buses.

The database contains architectural, cost and HDL implementation-specific information of building blocks to make them usable in processor generation. The data in HDB is stored in structured query language (SQL) relation tables. The used SQL database engine is SQLite [15]. Tables and relations of the HDB are sketched in Figure 2.7. Similar classes are implemented to represent the data in objects. The tables include architecture details for both FUs and RFs and implementation parameters. For each implementation there is a block source file which contains the hardware block implementation information in HDL. HDB can be viewed and edited with TCE tool HDBEditor.

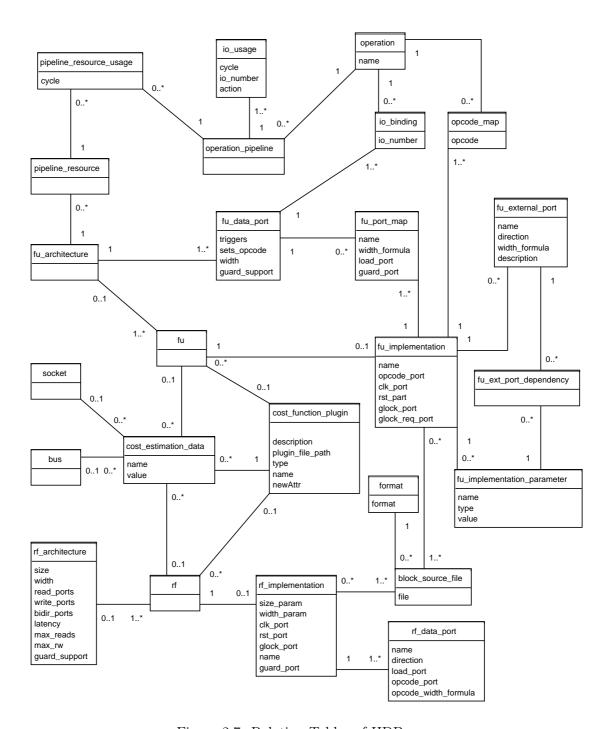


Figure 2.7: Relation Tables of HDB.

HDB is used by the explorer to look for architecture components and implementations. Also the estimator uses HDB to fetch cost data for implementations and the processor generator uses HDB when generating the processor description as HDL.

**Estimation Data** Cost estimation is one corner stone of the exploration. The data that the cost estimator produces is used to compare different configurations

with each other. With the estimation data it is possible to see if the configuration fulfills the given requirements and which configuration is preferred to another by terms of silicon area and energy consumption. The data must be accurate enough and different data is needed numerous of times during the design space exploration.

In TCE the cost estimation data is stored in HDB along the matching implementations. The estimator fetches the data from HDB and builds a cost database from it. This way the estimator is not dependent of the used technology since each HDB contains data for the components in that specific HDB. The estimation data can be obtained by analyzing the results of running logic synthesis tools and hardware simulators [16]. This process, called the technology characterization, can be automated and performed in advance and then used through HDB by all exploration runs for the technology the data is generated against.

The estimation data consists of energy, delay and silicon area values. For each clock cycle, an architecture component is assigned one of three energy activities: *Active*, *Stalled* or *Static*, and *Idle*. During an active clock cycle the component is performing its intended operation. For example, a register is active when it is being read or written. Component is static when it is not performing its intended operation but is holding information to be processed later. A component is idle when it is not active or stalled. This method of energy activities categorizing is referred to as the ASI method. [17] [18] [16]

The estimation data is used by the cost estimator that estimates if the processor fulfills the given requirements. The hardware cost estimator is used to evaluate the target processor area, energy consumption and execution time of an application executed by the processor. The hardware cost estimator uses HDB to look for the costs of the hardware components. In the easiest case the HDB contains cost data for all of the processor components and the estimator's task is simply to add the costs together to get the result. The target processor area and the execution time of the target application can be calculated simply with the knowledge of the set of components in the target processor. The energy estimate needs simulation data to get the execution times of the components. If the HDB does not contain data that matches the component details the cost estimator can use interpolation to find some estimate for the components. The interpolation is done by finding the nearest matching components and calculating the costs with linear interpolation. The estimation of different components are detailed later in Section 3.1.

Program Image and Processor Image Program Image Generator (PIG) is an

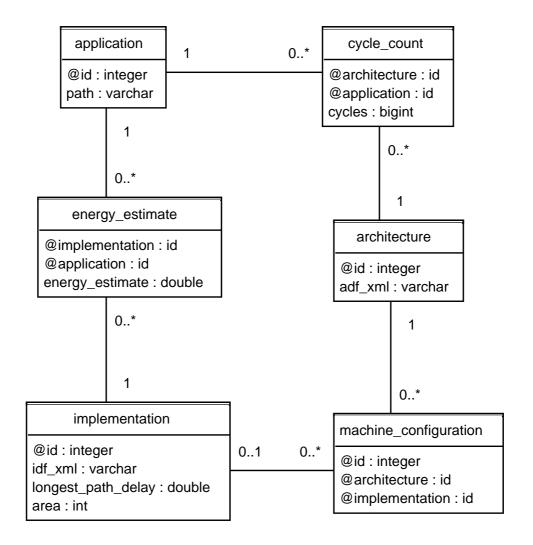


Figure 2.8: Tables and relations of DSDB.

application that generates a complete bit image of a TTA program in TCE toolset. The program image is a bit-level representation of a TTA program that is ready to be executed in a TTA processor where it is targeted to. [14] Processor image is generated with Processor Generator (ProGe) tool that generates TCE designed processor as HDL for the hardware synthesis.

Design Space Database The Design Space Database (DSDB) is used as a storage of explored configurations. DSDS is a database containing all the configurations explored with the Design Space Explorer and cost estimations for them. The explorer inserts new entry into the DSDB on each iteration it advances the exploration process. Entry contains at least the architecture and in most cases also the implementation and cost estimates for each application simulated and estimated against the configuration. DSDB is internally an relational database. Tables and relations of the DSDB are shown in the Figure 2.8. Each full machine configuration has one architecture and implementation which are

stored into the database in XML strings. For an incomplete configuration the implementation can also be omitted to store only the architecture information. Each architecture contains any number of cycle counts that is bound to number of applications in the application set. The cycle count tells how many cycles is needed to run the application and it is used to determine the timing of the configuration. The application table contains a directory path where the application directory is located on the disk. The implementation table contains the implementation information and the estimates of the longest path delay of the configuration and the chip area estimation. Each implementation can contain energy estimates that are bound to the applications of the application set. DSDB is implemented by using SQLite which is a software library that implements a Structured Query Language (SQL) database engine and it does not need a separate server process [15].

## 2.3 Design Space Exploration Process

Design space exploration process is sketched in Figure 2.9. Design space exploration is a process of finding out the best possible set of processor components and their implementations, which together can be considered as configurations, to run specific applications with some restrictive requirements. These requirements may set limits for the processor area or energy consumption and may include a time frame when the results of the application must be ready. This limits the number and type of resources, that a processor can contain and sets the goals for the design space exploration.

The configuration exploration process can be divided into two phases, resource optimization and connectivity optimization. The resource optimization phase modifies the architecture in component level by adding and removing units. In this phase all the configurations are fully connected and have enough buses not to limit the schedule. All resulting configurations have different cost/performance ratio. The most interesting configurations are such that are the fastest or the cheapest within a specific requirements. These interesting points are called the **Pareto points** [19, 20]. The results of this phase are fully connected configurations. The most interesting configurations of the resource optimization phase are taken into the second phase where the connectivity is optimized. In this phase the connections can be removed to reduce the area of the processor. [21]

The design space exploration process is started with some kind of minimal configuration that a program can be compiled for. The configuration contains architecture information and how the architecture components are implemented. This starting point configuration can then be used as a target machine by the compiler which together with scheduler creates the parallel program code that can be executed with

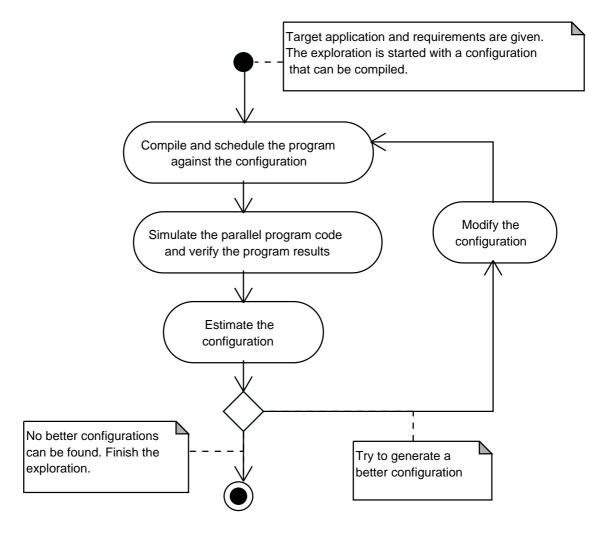


Figure 2.9: Exploration process.

the processor. This is where the iterative exploration process starts. Each iteration may result in a better configuration or not. Results of all phases can be used as a feedback for the next iteration and the process builds up as a loop where in each cycle the architecture is modified and then the compilation and scheduling is done followed by the compilation verification and analysis of the machine. These steps may be needed to be repeated numerous of times before the final configuration is found or there is always the possibility that the available components and component implementations are insufficient to fulfill the given requirements and the task is impossible no matter how good algorithms are processing the task.

Exploration is continued until the reasonable configurations are tested and no better results can be found. All the configurations and results are gathered for further inspection.

### 2.3.1 Manual Design Space Exploration

The tasks of the exploration process can be performed manually. By doing the exploration manually the designer can easily consider limitations and tricks that he can to achieve better results. Controlling the design is easy and good methods and common sense and experience can be utilized to create simple and effective processor models. Manual exploration is also a good approach to prove some new implementation or architectural designs. Special operations and components can easily be tested in machine configurations and find out the best practices. These practices can then be implemented to be used in automated design space exploration. Also utilizing different scheduling algorithms is easy in manual process.

Disadvantage of manual exploration is that it takes lots of time and high concentration from the designer to find out the best possible configuration. Good configurations might be created quite fast if the designer can see where the bottlenecks are but great results are much harder to achieve.

## 2.3.2 Semi-Automated Design Space Exploration

Semi-automated exploration is exploiting the automated tools and manually modifies the most potential results. The automated exploration algorithms have always some weaknesses that a good designer can easily patch by selecting reasonable components or even creating some special operations or units. Other possibility is to continue automated exploration from some manually modified configuration where some drawbacks of the algorithms are taken into account. Also the automated process may be guided manually by selecting some interesting configurations for further exploration.

# 2.3.3 Automated Design Space Exploration

Automated design space exploration is a process where the most suitable processor configuration is searched completely automatically. The designer's task is just to give the applications and requirements to the automatic explorer. The explorer generates multiple configurations and finds out the best possible configuration with the written algorithms. Automatic exploration performs all the exploration steps automatically and stores the gathered data as a result database that can be inspected afterwards. The advantage of an automated process is that it can try hundreds or even thousands of different combinations when finding out the best solution. Doing this manually would be far too time consuming and inefficient.

#### 2.3.4 Exploration in TCE

Since the TTA processor, like VLIW, itself does not contain the scheduling logic the programs need to be scheduled in the time of compilation. The architecture of the TCE scheduler is described in [22]. The compilation and scheduling depends on the structure of the processor's buses and components and the first step of exploration is to create a starting point TTA that contains the resources which are needed to compile the programs. In TCE there is a simple base machine file called minimal.adf that can be used as this initial architecture. TTA machine a is collection of processor elements which in TCE are written in Architecture Definition File the ADF. Processor elements of the ADF are detailed in Subsection 2.2.2. This initial architecture is basically the minimal architecture the teece compiler can stull compile any integer ANSI C programs for and so it contains all the needed operations for the first compilation. For a architecture component it is necessary to also select an implementation that details the logic of the architecture component. With the implementation information it is possible to fetch the correct HDL files from the hardware block library. These HDL files are needed in cost estimation and processor generation.

# 3. TCE DESIGN SPACE EXPLORATION FRAMEWORK

The design space framework in TCE consists of set of tools that the explorer core uses. The high level package description of the design space explorer in TCE is shown in Figure 3.1. The explorer core is called from a user interface which currently is command line based. GUI is also planned and might be implemented later. The explorer core is a client of different entities of TCE. The cost estimator is needed to estimate the costs of the architecture components while the simulation is also needed for the estimation. DSDB is used by the explorer to store the created configurations and result data of the configuration from the cost estimator. Explorer uses the scheduler for creating the parallel TTA code.

In this chapter the estimator package and the core of the explorer is discussed. The estimator classes are described in Section 3.1 and the explorer classes later in Section 3.2.

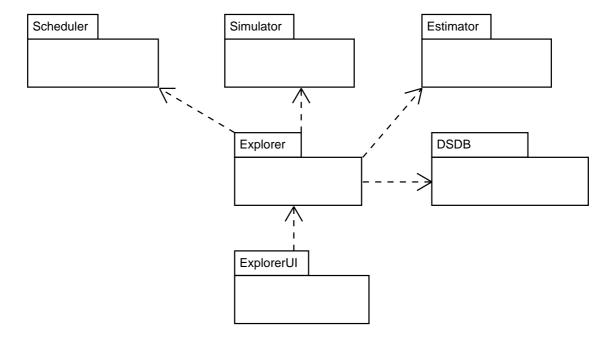


Figure 3.1: High level module relations of the design space explorer.

#### 3.1 Cost Estimator

The hardware cost estimator is responsible for evaluating the costs of the target processor. Costs include the used chip area, energy consumption and the timing for a set of applications. The maximum clock frequency of the processor configuration can be obtained from the timing evaluation. Results of the cost esimator are mainly used by the explorer to select the best implementations and components for the target processor. The best implementation is often the one that fulfills the given requirements but is minimal in costs. Estimation is an important phase of processor designing. In mobile processing where the processing power is not the only desired feature but the long battery life of the device is essential together with the processing performance there is a great interest for designing low energy consuming chips as possible. For example in these situations with a good approximation of energy consumption can the designer straight away decide which architecture models are too energy consuming and are not considered as final products.

Accuracy is the key aspect in cost estimation. The more accurate the estimate is the more useful it gets. The most accurate cost estimations would possibly be done by performing logic synthesis together with gate-level simulation for the complete processor. Synthesis is far too slow for automated design space exploration where there can be hundreds or thousands of processor models to estimate. Because the time requirements the accuracy of the estimation must be compromised. By generating the cost data in advance the cost estimator can obtain accurate enough data quickly. Good results can be generated by getting the costs of each component by performing logic synthesis with gate-level simulation to each component in advance. This can mean a huge amount of data and simulations if all variable changes must be simulated in advance. This is why the estimator is implemented to create an interpolation of the estimates where feasible if no strict match is found.

There are three different costs that are estimated from the processor. The area is simply the total area of silicon that is needed by the configuration. The total area is a sum of all sub areas that include areas of register files, function units, interconnection and control logic. Energy consumption is the total energy of the processor that it uses during a program execution including idle and active energies of the components. Delay is a time that is spent by the components and transfers during the execution. With delay estimations it is possible to estimate the speed of the processor configuration by resolving the longest path of the processor. The longest path of the processor is the maximum of the delay of any unit and the longest path found in the interconnection network through the processor logic. Interconnection network paths include all "output socket -> bus -> input socket" chains as well as "output socket -> bus -> input socket -> FU" chains.

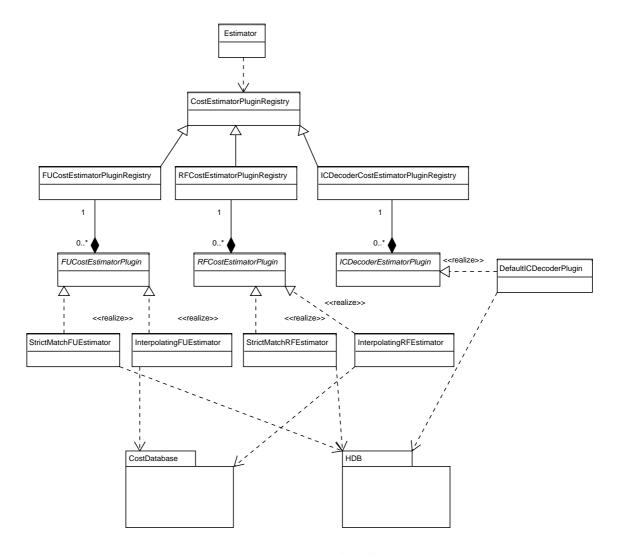


Figure 3.2: Estimator class diagram.

In the following section it is described how the cost estimator design and implementation is carried out in TCE and how the different costs are estimated.

## 3.1.1 Estimator Design

The cost estimator like other parts of TCE is designed with flexibility in mind. In cost estimation it is possible to experiment different algorithms. This requirement leads to such design of the Estimator that most of the actual algorithmic work is allowed to be redefined easily.

## 3.1.2 Estimator Implementation

Cost estimation process can be carried out in various of ways. Since the estimation methods can be researched and improved the TCE cost estimator is implemented to support different algorithms for estimation. The algorithms can be imported to

the estimator as estimation plugin. Estimator plugins are used to implement the estimation process. Each estimation plugin implements the interface of the base cost estimator plugin class that contains all necessary methods to estimate the processor components in terms of area, energy consumption and timing. Plugins may use different data or handle the data differently to find the best possible estimation results. Currently there are two kinds of cost estimation plugins implemented for the TCE: the strict match estimators which use exact matches of the components and the interpolating estimators which try to interpolate the missing component costs. Figure 3.2 represents the class structure of the cost estimator. The Estimator class contains methods to estimate different costs of the processor. The actual implementations of the different estimators are implemented in the plugins.

Different components are estimated a bit differently so there are their own implementations to estimate the FUs and the RFs and the interconnection network.

#### **RF** Estimation

The area estimation of RF is simple for the estimator since the area is already known during the data generation in gate level simulation and it is stored in HDB with all the other cost data of the components. The energy of an RF cannot be obtained directly from the cost database. For the energy estimation as described in [18] the cost estimator needs simulation data to know the register files are utilized. With the utilization statistics the RF energy can be obtained as follows

$$E_{RF} = E_{idle}U_{idle} + \sum_{read=1}^{n} \sum_{write=1}^{m} E_{read,write}U_{read,write}$$
(3.1)

 $E_{idle}$  is the idle energy of the RF (obtained from the cost database)

 $U_{idle}$  is the number cycles that the RF is idle (obtained from the simulation trace database)

n is the number of read ports that the RF contains

m is the number of write ports that the RF contains

 $E_{read,write}$  is the energy of the RF consumed when read ports are read and write ports are written (obtained from the cost database)

 $U_{read,write}$  is the number of times read reads and write writes occurs simultaneously into the RF (obtained from the simulation trace database).

#### **FU** Estimation

The area estimation of FUs is similar to RF area estimation. The value is simply fetched from the HDB. For the energy estimation of FUs the simulation data is again needed. The number of operation execution times is counted from each unit and the execution times are multiplied with the pre-estimated energy consumption of each operation. These estimates are also a result of gate level simulation and are stored as costs in HDB. Equation 3.2 shows how the energy of FU is summed up.

$$E_{FU} = E_{idle} N_{idle} + \sum E_k N_k \tag{3.2}$$

 $E_{idle}$  is the idle energy of the FU (obtained from the cost database)

 $N_{idle}$  is the number cycles that the FU is idle (obtained from the simulation trace database)

 $E_k$  is the energy of the FU consumed for performing operation k once (obtained from the cost database)

 $N_k$  is the number of times operation k was executed (obtained from the simulation trace database).

#### Strict Match Estimators

Estimator can evaluate the costs using the exact costs of a component. In this case all the cost data must be created earlier and added to the HDB. Strict match estimation gives the best possible estimation values with the selected estimation method. All the component costs are as near as possible to the real values. Strict match estimator implementations are quite simple. They fetch cost data for each component from the HDB. Result is gained by simply adding cost values of each component to the result. Area estimation adds all of the component areas to the result and there we have the area estimation. Energy estimation needs data from the simulator to get the counts of operation usages, transfers to and from the registers and idle times. These values are also fetched from the HDB and then added as result when multiplied with the usage counts.

#### **Interpolating Estimators**

Making synthesis and gate-level simulations to all possible variations of components would be very time consuming and the database would grow significantly. This is why the amount of strict matches is reasonable to be compromised. With linear interpolation it is possible and quite easy to obtain data with sufficient accurate for such components which do not have strict match estimations. Having one similar

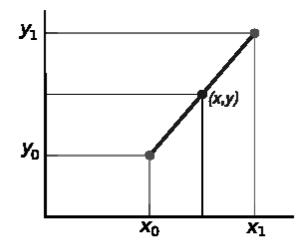


Figure 3.3: Linear interpolation.

component estimated with greater and smaller variable the estimate can be counted with a linear equation from the lower point to the higher. The interpolating estimators in TCE use own data structure build as the CostDatabase where all cost information from HDB is collected.

All parameter variations are not suitable for linear interpolation. In RFs the most reasonable variable for interpolation is the number of registers. The costs grow quite linearly when more registers are added so it is not necessary to synthesize cost data for all possible register number combinations for a RF. However, more accurate results can be interpolated if there are some estimates between the minimal number and the maximum (reasonable) number of registers. Figure 3.3 shows how the estimate is interpolated from the existing cost data. The nearest greater and smaller value is selected for the interpolation and the cost is

$$y = y_0 + (x - x_0) \frac{y_1 - y_0}{x_1 - x_0}. (3.3)$$

## 3.2 Explorer

Explorer in TCE consists of multiple classes. Figure 3.4 details the classes and relations of the explorer. The classes shown in the class diagram are described in the following sections.

# 3.2.1 Design Space Explorer

Design space explorer is the front-end of the explorer. It is a class that hides the complex call hierarchies from the user, which is a realization of **façade** design pattern [23]. Design space explorer interface provides methods to automatically evaluate

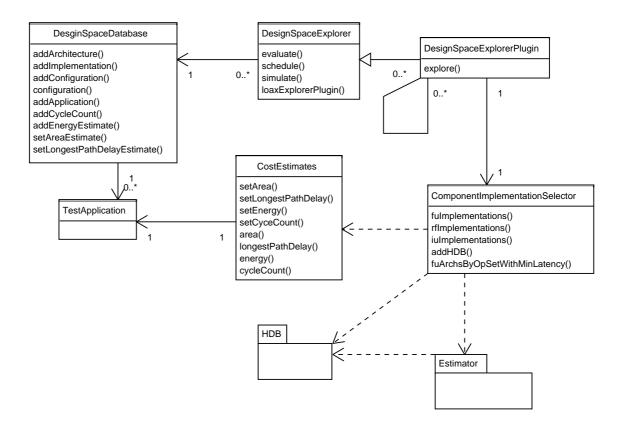


Figure 3.4: Explorer class diagram.

machine configurations and to select best implementations to the processor components according to the test applications set in Design Space Database (DSDB). Command line interface uses the methods of DesignSpaceExplorer class to relay the parameters given by the user for the explorer. Through the front-end class it is possible to get the DSDB instance and output the results for the user.

## 3.2.2 Design Space Database

Design Space Database (DSDB) is a database containing the exploration specific data. The database holds ADF and IDF files of configuration and data that is estimated against these files. The database is used through DSDBManager class which contains methods to create queries to the database. It is possible to perform all needed data inserts and queries to add and get all the data with the DSDBManager. The used database is currently SQLite but the idea of the DSDBManager class is that the database technique can be changed by modifying only the front-end class and no changes for the DSDBManager client is needed. The architectures and implementations in the database can also be written as ADF and IDF files with the DSDBManager.

### 3.2.3 Design Space Explorer Algorithm Implementation

Design space explorer algorithms are implemented as design space explorer plugins. Explorer plugins can be parts of the exploration chain or they can contain fully functional explorers. The main idea of the plugin approach is the easy modularization of the exploration process. With plugins the big complex exploration scheme can be split to small blocks that can be tested and developed separately. One approach could be that plugins are small explorers that can call other exploration plugins so the final exploration output may be a result of many phases where the design space is travelled to and forth in multiple steps. One advantage of the plugin approach is also that new plugins are easy to create and import in future so that researches can use their own exploration algorithms instead of the ones that are done into the TCE distribution. Developing explorer in small sub explorers gives also researchers and developers plenty of possibilities to do the small sub-tasks in order they find the best.

Algorithms can be controlled with parameters. Parameters can be passed to algorithms as pairs of name and value. Using parameters in the algorithms' implementations is fully optional. Each algorithm may have operability guided with own parameters if appropriate or algorithms can be so called pure algorithms.

There are a few required inputs for the algorithms. These are the name of the algorithm and the DSDB where the results are stored. Also the ID of the configuration where the algorithm begins to make progress is needed when the algorithm is launched.

All the results of the implemented exploration plugins are added into the DSDB. Results of the exploration plugins include the ADF and the IDF files and the calculated estimations of the configurations. From DSDB the results can be fetched for later use, for observing or manual fine tuning.

## 3.2.4 Component Implementation Selector

The purpose of the component implementation selector is to provide methods for selecting suitable implementations to the given architecture components. The component implementation selector uses HDB to look for the implementations and returns a set of suitable implementations that fulfill the given cost requirements such as the clock frequency or the gate area of the component. ComponentImplementationSelector class uses the cost estimator to estimate the costs of the suitable implementations and determines from the results if the implementation is good for this purpose. The class has methods for searching suitable implementations for function units, register files and immediate units. Implementations are searched for matching the given architecture and meet the speed and area requirements if given.

The component implementation selector can search suitable implementations from multiple HDB files. The returned implementation location tells the HDB and the entry of the HDB where the implementation lies.

#### 3.2.5 Cost Estimates

Cost estimates are estimates for a machine configuration (ADF+IDF). The CostEstimates class stores the estimates of each configuration. These estimates include the area of the processor configuration which is presented as number of gates. Longest path delay is the delay of the processor's critical path that is the speed bottleneck of the configuration. The longest path delay value is presented in nano seconds. The energy consumption of the configuration while processing the used application is presented in milli joules. The fourth estimate value is the cycle count of the processor with the current configuration and application which is presented in number of clock cycles. The area and the longest path delay are constants to one machine configuration while there can be multiple programs run with that configuration. Therefore there can be multiple energy consumption estimations and cycle counts as well out of one machine configuration. Each energy consumption and cycle count is bound to one application that can be run with the machine configuration.

### 3.2.6 Test Application

Test application class is a helper class for the explorer to handle application specific files. The applications that are run with the TTA processor being explored are inserted into the test application directories. These directories contain files that are needed by the explorer to ensure the correct functionality and speed requirements of the processor configurations. Files include instructions to simulate the program and verify the simulation. Methods include checkers for files and getters for simulation execution and simulation output verification files:

- description(): A method that returns description file of the test application directory.
- correctOutput(), A method that returns the correct program output string for ensuring the architecture functioning.
- setupSimulation(): A method that sets up the simulation run by running the setup script of the test application directory.
- simulateTTASim(): A method that returns an input stream to simulate.ttasim file of the test application directory which can be given to the TTA simulator.

- maxRuntime(): A getter method that returns the maximum runtime requirement of the test application.
- applicationPath(): A method that returns a directory path of the sequential program file of the test application directory.
- verifySimulation(): A method that executes the verify script of the test application directory. Return value is true if the verifying was a success.
- hasApplication(): Returns true if 'program.bc' file is in the test application directory.
- hasSetupSimulation(): Returns true if 'setup.sh' file is in the test application directory.
- hasSimulateTTASim(): Returns true if 'simulate.ttasim' file is in the test application directory.
- hasCorrectOutput(): Returns true if 'correct\_simulation\_output' file is in the test application directory.
- hasVerifySimulation(): Returns true if 'verify.sh' file is in the test application directory.
- hasCleanupSimulation(): Returns true if 'cleanup.sh' file is in the test application directory.

Test application directory must have at least the files for the sequential program and a way to verify the output. Also the maximum runtime is needed for creating reasonable TTAs.

#### 4. EXAMPLE EXPLORATION ALGORITHM

The design space explorer's brains are in the exploration algorithms. Explorer algorithms are the guide for the explorer to do it's job. These algorithms can always be improved and new ideas invented. This is why the explorer algorithms can be added as runtime libraries for the Design Space Explorer. Explorer algorithms can be implemented as code sections that are derived from the DesignSpaceExplorerPlugin class which can be seen in Figure 3.4. Plugins need to re-implement the explore() method of the parent class where the plugin algorithm functionality and complexity is hidden. Plugins can be used with explorer after compiling. Compiling can be done with the aid of script named buildexplorerplugin.

Algorithms store all results to Design Space Database (DSDB). The starting point configuration is given for the plugins and it can be any of the configurations added to the DSDB. Configurations include initial architecture and architecture implementation. Architecture implementation may also be empty as can be the architecture when the plugin starts exploring from the scratch.

Plugins can be guided with parameters passed from the explorer application. Parameters can be given as name-value pairs.

## 4.1 Frequency Sweep Explorer Algorithm

Frequency sweep is an exploration algorithm that travels through the design space by setting one frequency at a time as a target frequency of the processor configuration. The frequency limits and the interval are given by user. Frequency sweep is done by using the lowest frequency first and then stepped towards the upper limit. Eg. if the target limits are 100-200MHz and the interval is 50MHz would the algorithm try to generate processor configurations with frequencies 100MHz, 150MHz and 200MHz. The plugin parameters and their explanations are shown in Table 4.1.

Frequency sweep algorithm tries first to optimize the number of cycles needed to run the programs. This part is described in Section 4.2. Minimizing the cycle count in the first stage of exploration is done to achieve less energy consumpting results. Smaller cycle count ends up to lower clock frequency needs and most possibly less energy consuming processors.

Second phase of the algorithm is to optimize the execution time. In this phase are the implementations to each component selected. The interconnection network

Parameter Name	Purpose				
start_freq_mhz	Frequency sweep starting frequency in MHz.				
$end\_freq\_mhz$	Frequency sweep ending frequency in MHz.				
$step\_freq\_mhz$	Interval of the frequency sweep in MHz.				
superiority	This parameter is passed further to the cycle count minimiza-				
	tion plugin to indicate how many percents better must the				
	new cycle count be compared to the previous one to continue				
	the cycle count optimization.				

Table 4.1: Parameters

(IC) is optimized after selecting the components. The second phase algorithm is described in Section 4.3

Finally if the previous phases constructed configurations that fulfills the requirements then the algorithm is advances to the final optimization phase. These optimizations are described in Section 4.4. The final optimization is not yet implemented in the current version of the Frequency sweep algorithm but it can be added easiest by creating the functionality in a separate explorer plugin.

```
1: minF
                                 ▶ User given parameter for minimum frequency.
 2: maxF
                                 ▷ User given parameter for maximum frequency.
3: stepF
                                       ▶ User given parameter for step frequency.
 4: superiority
                                                        5: C
                                                                ▶ Configuration
 6: currentF \leftarrow minF
 7: cycleOptArchs \leftarrow OptimizeCycleCount(C, superiority)
 8: repeat
      for all cycleOptArch in cycleOptArchs do
9:
          if FASTENOUGH(cycleOptArch, curMhz) then
10:
             minArch \leftarrow MINIMIZEMACHINE(cycleOptArch)
11:
12:
             minConf \leftarrow SELECTIMPLEMENTATIONS(minArch)
                                        ▶ Also stores the optimized configuration
13:
             ICOPTIMIZE(minConf)
   into the DSDB.
          end if
14:
      end for
15:
      currentF \leftarrow currentF + stepF
16:
      if currentF > maxF then
17:
          currentF \leftarrow maxF
18:
      end if
19:
20: until currentF \neq maxF
```

Figure 4.1: Frequency sweep algorithm.

```
1: procedure OPTIMIZECYCLECOUNT(C, superiority)
       2:
                                            minCycles_n \leftarrow MinCycleCount(C)
       3:
                                            minCycles_{n-1} \leftarrow 0
       4:
                                           repeat
                                                                 C_{best} \leftarrow C
       5:
                                                                 minCycles_{n-1} \leftarrow minCycles_n
       6:
                                                                 C \leftarrow \text{AddResources}(C)
       7:
                                                                 minCycles_n \leftarrow MinCycleCount(C)
       8:
                                            until minCycles_n < minCycles_{n-1} \&\&(superiority/100 * minCycles_{n-1}) < minCycles_n < minCycle
                        (minCycles_{n-1} - minCycles_n)
                                            return C_{best}
10:
11: end procedure
```

Figure 4.2: Cycle count optimization algorithm.

#### 4.2 Cycle Count Optimization

Pseudo code of the cycle count minimization algorithm is sketched in Figure 4.2. The algorithm is implemented in the GrowMachine exploration plugin. Goal of the algorithm is only to minimize the cycle count, so no estimation or implementation selection is done and the configuration  $C_{best}$  will have lots of extra resources.

To achieve the minimal cycle count are the resources of the processor increased so much that the processor architecture has enough resources to process the code in optimal amount of clock cycles. In the algorithm sketched in Figure 4.2 the resources of the configuration C are grown in each cycle of the repeat-until loop. The minimum cycle count is then counted for the intend application set. The minimum amount of clock cycles is reached when the scheduler can no longer make significantly better results. The percentage value when the result is no longer considered better even if there is a slight improvement can be given by the user. This gives the a way to optimize the exploration time when the largest configurations are already selected out and there is no need to schedule and estimate the runtime of those configurations.

The algorithm returns the fastest configuration it founds. Still as all the intermediate results are also stored in the DSDB is the results after this phase a set of architectures that have large number of resources but the scheduled programs to these architectures are executed efficiently.

# 4.3 Execution Time Optimization

After the minimum number of clock cycles needed by the architecture to run the specified applications are found, the execution time constraints of the applications are considered if they are possible to achieve. Execution time is bound to the clock cycle count and the clock frequency of the processor. The clock cycle count cannot

be improved at this point but the clock frequency can be tuned up with selecting suitable components and making the connection network as fast as possible. These actions will certainly weaken the cycle count performance and so it is first calculated if it is possible to meet the runtime requirements with one target frequency. One frequency is set as target at a time beginning the lowest frequency and stepped towards the highest.

Execution time optimization removes extra components from the machine that were generated in the cycle count optimization phase. The resource removal is implemented in the MinimizeMachine explorer plugin. After the resource minimization the implementations are selected for every component. The interconnection network can be optimized after the implementation selection. This is done with another explorer plugin SimpleICOptimizer.

### 4.3.1 Selecting Components

Architecture component implementations are selected to meet the target processor frequency. Too fast component implementations may contain more logic that takes area and consumes energy. That is why the components are selected to be fast enough but the costs of the components low as possible. If multiple candidate implementations for the component are found is the smaller input and delays preferred. If there still are multiple possibilities the least energy consuming implementation is selected.

It is always possible that the given architecture is the speed bottleneck of the processor and the time requirements are not met. In these cases there are no possible implementations for given function unit architecture. The function architecture can be changed by raising the latency of the FU. This way suitable implementations may be found.

## 4.3.2 Removing Unnecessary Components

Unnecessary components are removed by minimizing the machine. Purpose of the Minimize machine algorithm is to remove resources from the processor architecture until the real time requirements of applications are not reached anymore. Minimizing the machine thereby optimizes the resources of the machine by reducing the extra ones.

At first the maximum running time of each application that the machine should run is converted to cycle count. If no maximum run time is given, there is no time limit and the maximum cycle count that the processor is allowed to run the application is unlimited as long as the application can be executed. Figure 4.4 shows the maximum cycle count computation.

After the maximum cycle counts have been computed the resources are reduced. At first the not needed buses are removed. After that possible extra function units and finally extra register files are removed. Minimizing the number of buses is done by removing some number of buses from the original architecture. After the removal the configuration is evaluated against each program. If any of the cycle counts exceeds the calculated minimum cycle count is the number of removed buses too high. Otherwise more buses can be tried to remove. Binary search algorithm is used for solving out the number of buses that can be removed. With binary search the number of iterations can be optimized. The minimizing of buses is shown in Figure 4.3. The returned configuration is minimized in number of buses because if more buses are removed the cycle counts get too high. The algorithm implements a binary search algorithm and thereby it has an efficiency of  $O(\log n)$ .

After the buses have been minimized the FUs are minimized. At first the FUs in the architecture are analyzed and the number of similar units is counted. Then each type of FUs is tried to be reduced and after each removal the architecture is tested to still reach the requirements. If the removal prevents the configuration to meet the requirements the last working configuration is restored and next type of FU is tried to remove. RFs are minimized after the FU minimization and it is carried out similarly to FU minimization. After other minimizations the sockets that no longer connect any units are removed from the machine.

### 4.3.3 IC Optimization

Removal of the unneeded connections and sockets reduces the energy consumption and area needed by the configuration. The IC can be simply optimized by removing the connections that are not used. This is an easy way of reducing the connectivity. After this every connection removal means that the schedule has to be changed. The SimpleICOptimizer plugin that currently implements the interconnection network optimization first schedules optimized configuration to get the parallel program code. Then it removes all the connections from the machine and adds those connections back in place that are used in the scheduled program instructions. This way all the extra connections that are not used can be removed. Those sockets and units that no longer are connected to any buses can now also be dropped out. Finally the functionality if the new optimized configuration is tested.

# 4.4 Final Optimization

The final optimization phase is not yet implemented in the current explorer but the original plan is described as follows.

In the final phase the explorer has a set of configurations that are fast enough

```
1: high H \leftarrow C_b
                                           \triangleright C_b is the number of buses in configuration
 2: low L \leftarrow 1
 3: middle M \leftarrow (L+H)/2
 4: for all a in set of applications A (that should be run with the configuration C)
 5:
        if cycles of application in current configuration a_C > a_{max} then return C
 6:
        end if
 7: end for
 8: while L < M do
        minimized configuration c \leftarrow C_b - M
9:
        lowerM \leftarrow true
10:
       for all a in set of applications A that should be run with the configuration
11:
    C do
12:
           if cycles of application in minimized configuration a_c > a_{max} then
               L \leftarrow M + 1
13:
               M \leftarrow (L+H)/2
14:
               lowerM \leftarrow false
15:
           end if
16:
       end for
17:
       if lowerM = true then
18:
           H \leftarrow M - 1
19:
           M \leftarrow (L+H)/2
20:
        end if
21:
22: end while
23: return c
```

Figure 4.3: Minimizing buses.

Figure 4.4: Maximum cycle count computation.

from the previous steps of exploration. The final optimization concentrates on three things. Firstly can the FU's be changed to ones with smaller latency implementations. If the configuration still fulfills the requirements after a FU change it can and will be done. Secondly all the components are considered if some can be changed to one with smaller energy consumption. Finally all the components are considered if they can be changed to ones with smaller area. These three optimization checks makes the result configuration to be fastest, least energy consuming and smallest in

- 1: for all Configuration c in set of configurations C do  $\triangleright$  Each configuration from previous steps are optimized.
- 2: CHANCEFUSTOSMALLERLATENCY(c)
- 3: CHANGECOMPONENTSTOMINIMIZEENEGY(c)
- 4: CHANGECOMPONENTSTOMINIMIZEAREA(c)
- 5: end for

Figure 4.5: Final optimization algorithm.

area with the available set con component implementations. The idea of the algorithm can be seen in Figure 4.5. The configuration is always evaluated to still reach the given requirements after component changes so the called methods should alter the given reference configuration only if the configuration is optimized in some way.

After the final optimization phase the frequency sweep algorithm has done it's best to find configurations against one clock frequency. The exploration will then continue from the next clock frequency step.

#### 5. BENHMARKING AND VERIFICATION

The explorer plugins were tested against three different benchmark applications: two different Discrete cosine transform (DCT) applications, one that computes the transform to a 8 x 8 matrix and other that computes 32 bit transforms and one of the benchmark applications implements the Viterbi algorithm introduced in [24].

#### 5.1 Algorithm Verification

To verify the Frequency sweep algorithm the sub-algorithms were verified to function as they were intent to. Then the Frequency sweep exploration algorithm was tested in whole.

#### 5.1.1 Verification of GrowMachine plugin

The GrowMachine exploration algorithm Section 4.2 is used first by the Frequency sweep. In Table 5.1 is shown how the GrowMachine algorithm have optimized the cycle counts of the Viterbi application. The superiority was set to one (1) percent and the algorithm ended after the Row 10 when the cycle count improvement was no longer better than one percent. Rows 2-9 were then selected to further investigation.

Row	Program	Cycles	Improvement %				
1	viterbi	31147383	=				
2	viterbi	6548954	78,9743%				
3	viterbi	3945912	$39{,}7474\%$				
4	viterbi	2631193	$33,\!3185\%$				
5	viterbi	2021880	$23{,}1573\%$				
6	viterbi	1726200	$14,\!624\%$				
7	viterbi	1621128	$6,\!0869\%$				
8	viterbi	1565642	$3,\!42268\%$				
9	viterbi	1549802	1,01173%				
10	viterbi	1548746	0.061377%				

Table 5.1: Viterbi cycle count optimization.

The total drop of the cycle count in this case was nearly 95% from the original architecture.

#### 5.1.2 Verification of MinimizeMachine Plugin

The MinmizeMachine removes resources from the architecture until the speed requirements are not met anymore. MinimizeMachine algorithm was tested by adding components to a already minimized machine and running the algorithm against this architecture. The algorithm successfully removed the extra components and stopped when the cycle count and target frequency limited the removing of more components.

#### 5.1.3 Verification of SimpleICOptimizer Plugin

The SimpleICOptimizer algorithm removes the connections that are not used by the scheduled program. When started the algorithm with a fully connected architecture that was generated for the DCT8x8 program the architecture contained total of 374 bus to socket connections. After the SimpleICOptimizer algorithm was the number of connections dropped to 345 giving total of 39 removed connections. This connection removal changed also the area estimate to drop from 22632 gates to 21146 gates.

#### 5.2 Testing of Example Algorithm FrequencySweep

Table 5.2 represents exploration results of program that counts the DCT 8 x 8 matrix. The exploration was run by using the Frequency Sweep algorithm and sweeping frequencies from 50MHz to 200MHz with 50MHz steps. The maximum execution time of the program was set to 0,01 seconds. In Figure 5.1 the graph contains the chip area (gates) and energy estimate (mJ) of the generated configurations. The figure presents those points of the exploration results where the speed requirements were fulfilled and the functionality of the program was tested to work correctly. The FrequencySweep algorithm takes care that the execution time limit is not theoretically exceeded when running the program with target frequency. Points in the result table and graph are placed in the same order the configurations were generated by the algorithm developed in this thesis. The peaks in the graph are the points from the first configurations of each sweeping frequency optimized successfully in basis of the cycle count minimization. Then the reducing of the components is shown in decreasing chip area and energy. In Figure 5.2 the execution time of the DCT 8 x 8 program is drawn with the energy values. The execution time is calculated by dividing the cycle count numbers with the target frequencies. All the configurations fulfill the execution time constraint.

In Table 5.3 are the results given by the Frequency sweep algorithm when explored against the Viterbi program. The program was given a maximum execution time of 0,1 seconds and the frequencies 50MHz to 200MHz with steps of 100MHz.



Figure 5.1: DCT 8x8 energy and area of configurations.

Figure 5.3 shows the energy and area values of the configurations after the exploration. The results are quite similar to the DCT8x8 program and the speed limits

Table 9.2. De love Results									
Row	Target MHz	ID	Program	Cycles	Energy	Path	Area		
1	50	83	dct8x8	198791	0,01837610	14,01	23485,10		
2	50	147	dct8x8	198791	0,00651983	$13,\!51$	21146,80		
3	50	200	dct8x8	198791	0,00642959	13,15	$17625,\!80$		
4	50	241	dct8x8	198791	0,00550757	13,04	14738,90		
5	50	270	dct8x8	199047	0,00494168	12,79	11649,90		
6	100	346	dct8x8	198791	0,01837610	14,01	23485,10		
7	100	410	dct8x8	198791	0,00651983	13,51	21146,80		
8	100	463	dct8x8	198791	0,00642959	13,15	17625,80		
9	100	504	dct8x8	198791	0,00550757	13,04	14738,90		
10	100	533	dct8x8	199047	0,00494168	12,79	11649,90		
11	150	608	dct8x8	1025441	0,08510110	13,98	18199,80		
12	150	671	dct8x8	1025441	0,02898850	13,48	$15987,\!80$		
13	150	723	dct8x8	1025409	0,02866230	13,12	$12654,\!00$		
14	150	763	dct8x8	1028737	$0,\!02385550$	13,01	$9901,\!50$		
15	150	791	dct8x8	1096166	0,02101670	12,76	$6900,\!25$		
16	200	866	dct8x8	1025441	0,08510110	13,98	18199,80		
17	200	929	dct8x8	1025441	$0,\!02898850$	13,48	15987,80		
18	200	981	dct8x8	1025409	0,02866230	13,12	12654,00		
19	200	1021	dct8x8	1028737	$0,\!02385550$	13,01	$9901,\!50$		
20	200	1049	dct8x8	1096166	0,02101670	12,76	6900,25		

Table 5.2: DCT8x8 Results

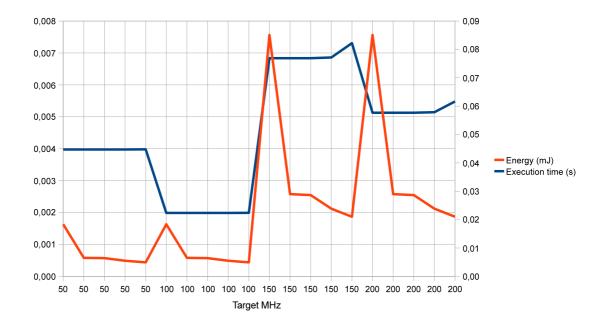


Figure 5.2: DCT 8x8 execution time and energy of configurations.

Table 5.3: Viterbi Results

Table 6.6. Viteral results								
Row	Target Mhz	ID	Program	Cycles	Energy	Path	Area	
1	50	117	viterbi	5952840	0,690206	13,46	29688,60	
2	50	213	viterbi	5952841	0,736374	$13,\!25$	26757,80	
3	50	298	viterbi	5952840	0,669696	13,17	$23083,\!80$	
4	50	372	viterbi	5970264	0,560587	14,01	20092,60	
5	50	434	viterbi	5952840	$0,\!226883$	13,49	17489,60	
6	50	485	viterbi	5953368	$0,\!224529$	13,13	$13712,\!60$	
7	50	524	viterbi	5952840	$0,\!193082$	13,02	10569,60	
8	150	632	viterbi	8645661	0,880884	13,45	27153,60	
9	150	729	viterbi	8645662	0,972640	13,24	24078,60	
10	150	815	viterbi	8645661	0,885556	13,16	20714,30	
11	150	890	viterbi	8646189	0,777804	13,98	18070,30	
12	150	953	viterbi	8645661	$0,\!305352$	13,48	$15858,\!40$	
13	150	1005	viterbi	8645661	0,302699	13,12	12524,60	
14	150	1045	viterbi	8646189	$0,\!261887$	13,01	9772,10	
15	150	1073	viterbi	8649359	$0,\!235679$	12,76	6834,85	
16	200	1181	viterbi	15254700	1,354640	13,49	23935,60	
17	200	1278	viterbi	15254701	1,503230	13,28	21269,10	
18	200	1364	viterbi	15254701	1,367210	13,20	18341,80	
19	200	1439	viterbi	15254700	1,202170	14,02	16060,90	
20	200	1502	viterbi	15254700	$0,\!459604$	$13,\!52$	$14238,\!10$	
21	200	1554	viterbi	15254700	$0,\!455299$	13,16	$11322,\!60$	
22	200	1594	viterbi	15254700	0,392275	13,05	8935,60	
23	200	1622	viterbi	15254701	0,352727	12,80	6381,10	

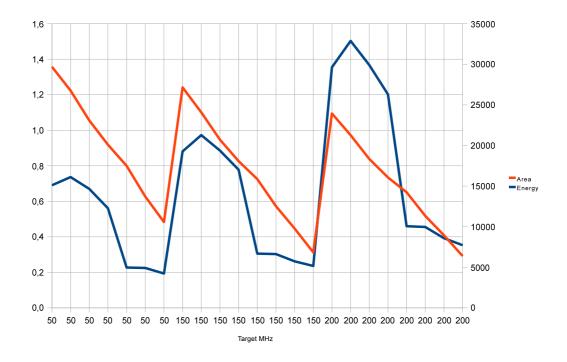


Figure 5.3: Viterbi energy and area of configurations.

are not exceeded. Figure 5.4 shows the execution times and energies of the result configurations. The figure shows that the execution time is not exceeded.

Table 5.4 shows the results from the DCT32 program when maximum time limit was set to 0,005 and frequencies swept from 100MHz to 600MHz in steps of 250MHz. In cases of 100MHz and 350MHz the resulting configurations were equal. In case of 600MHz target frequency the HDB did not contain any implementations that would have been fast enough and no configurations could be found.

It was also tested though that when the time constraint was too tight there were no results. The Frequency sweep algorithm was stated as deterministic by running the same tests multiple times with same results.

10010 011 2 0 102 1100 0110								
Row	Target MHz	ID	Program	Cycles	Energy	Path	Area	
1	100	45	dct32	108314	0,00236824	13,05	9090,25	
2	100	74	dct32	108314	0,00208706	12,80	$6474,\!25$	
3	350	115	dct32	108314	0,00236824	13,05	$9090,\!25$	
4	350	144	dct32	108314	0,00208706	12,80	$6474,\!25$	
-	600	-	dct32	-	-	-	-	

Table 5.4: DCT32 Results

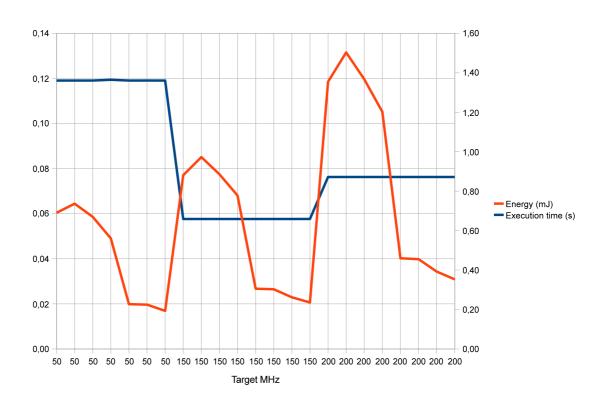


Figure 5.4: Viterbi execution time and energy of configurations.

#### 6. CONCLUSIONS

The existence of a mathematical cost function is necessary to find an optimum. Finding the minimum of the cost function is achieved by using advanced mathematical algorithms. This is understood by the term automation. Very often finding the optimum requires human interaction. The automated design space exploration tool created and described in this thesis is a tool that makes it possible to run and test ideas and algorithms of a designer in the area of design space exploration of TTAs. The implemented example algorithm of the exploration tool can guide the designer to find and choose the optimal design. The optimum might need some fine tuning from the designer but at least it gives the right direction and idea of which kind of configuration works best. Also it is a good example if new algorithms are being developed.

This thesis presented a design framework of TTA design space exploration and an automated tool to exploit it. The thesis describes the exploration process in TCE by using the available toolset. Furthermore the thesis describes the explorer application and the example algorithm for the explorer.

The exploration algorithms are designed to be modular and such that it is easy to attach and create new exploration and estimation algorithms as plugins. Estimation is also designed to be technology independent. The exploration plugins can have any number of parameters and may use other exploration plugins.

The results that were achieved by testing the example algorithm show that the framework can give results in right direction. The algorithm is proved to produce working configurations. Ideas for further development can be obtained from the exploration results. The explorer also shows that the TCE framework is functional.

In conclusion, there are still many things to develop to create a better exploration results more easily. One thing is to create such an interpolating estimator that can handle more variations in the estimated components. This would ease the initial work for creating cost estimation data for each technology which is currently a very time consuming process and takes lots of megabytes which also slows down the actual exploration. Of course this would decrease the accuracy of the estimate but would give an easier and faster way to compare different technologies. Other improvement places include the different optimization phases of the exploration. The result given by the described algorithm is not final and can be optimized at

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least in connectivity. Also the interaction between the compiler could be better by giving parameters. Also a GUI for explorer would be a good way to visually see the differences of the configurations and to manage the flow. Adding a GUI is possible since the architecture is designed in such way that different interfaces can be built.

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