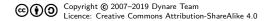


The Dynare Preprocessor

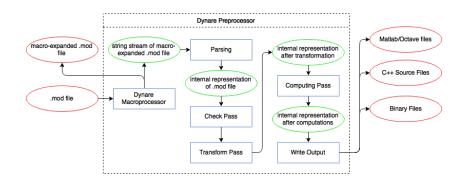
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1 February 2017



Overview



Outline

- Invoking the preprocessor
- 2 Parsing
- 3 Data structure representing a mod file
- 4 Check pass
- Transform pass
- 6 Computing pass
- Writing outputs
- 8 Proposed Changes

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Calling Dynare

- Dynare is called from the host language platform with the syntax dynare «filename».mod
- This call can be followed by certain options:
 - Some of these options impact host language platform functionality, e.g. nograph prevents graphs from being displayed in MATLAB
 - Some cause differences in the output created by default, e.g. notmpterms prevents temporary terms from being written to the static/dynamic files
 - While others impact the functionality of the macroprocessor or the preprocessor, e.g. nostrict shuts off certain checks that the preprocessor does by defalut

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Parsing overview

- Parsing is the action of transforming an input text (a mod file in our case) into a data structure suitable for computation
- The parser consists of three components:
 - the lexical analyzer, which recognizes the "words" of the mod file (analog to the vocabulary of a language)
 - the syntax analyzer, which recognizes the "sentences" of the mod file (analog to the grammar of a language)
 - the parsing driver, which coordinates the whole process and constructs the data structure using the results of the lexical and syntax analyses

Lexical analysis

- The lexical analyzer recognizes the "words" (or lexemes) of the language
- Defined in DynareFlex.11, it is transformed into C++ source code by the program flex
- This file details the list of known lexemes (described by regular expressions) and the associated token for each of them
- For punctuation (semicolon, parentheses, ...), operators (+, -, ...) or fixed keywords (e.g. model, varexo, ...), the token is simply an integer uniquely identifying the lexeme
- For variable names or numbers, the token also contains the associated string for further processing
- When invoked, the lexical analyzer reads the next characters of the input, tries to recognize a lexeme, and either produces an error or returns the associated token

Lexical analysis

An example

Suppose the mod file contains the following:

```
model;
x = log(3.5);
end;
```

- Before lexical analysis, it is only a sequence of characters
- The lexical analysis produces the following stream of tokens:

```
MODEL
SEMICOLON
NAME "x"
EQUAL
LOG
LEFT_PARENTHESIS
FLOAT_NUMBER "3.5"
RIGHT_PARENTHESIS
SEMICOLON
END
SEMICOLON
```

Syntax analysis

In Dynare

- The mod file grammar is described in DynareBison.yy, which is transformed into C++ source code by the program bison
- The grammar tells a story which looks like:
 - A mod file is a list of statements
 - A statement can be a var statement, a varexo statement, a model block, an initval block, ...
 - ► A var statement begins with the token VAR, then a list of NAMEs, then a semicolon
 - ▶ A model block begins with the token MODEL, then a semicolon, then a list of equations separated by semicolons, then an END token
 - An equation can be either an expression, or an expression followed by an EQUAL token and another expression
 - ► An expression can be a NAME, or a FLOAT_NUMBER, or an expression followed by a PLUS and another expression, . . .

Syntax analysis

Using the list of tokens produced by lexical analysis, the syntax analyzer determines which "sentences" are valid in the language, according to a grammar composed of rules.

A grammar for lists of additive and multiplicative expressions

- (1+3)*2; 4+5; will pass the syntax analysis without error
- 1++2; will fail the syntax analysis, even though it has passed the lexical analysis

Semantic actions

- So far we have only described how to accept valid mod files and to reject others
- But validating is not enough: one needs to do something with the parsed mod file
- Every grammar rule can have a semantic action associated with it:
 C/C++ code enclosed by curly braces
- Every rule can return a semantic value (referenced by \$\$ in the action)
- In the action, it is possible to refer to semantic values returned by components of the rule (using \$1, \$2, ...)

Semantic actions

An example

A simple calculator which prints its results

```
%start expression_list
%type <int> expression
expression_list := expression SEMICOLON
                     { cout << $1 << endl: }</pre>
                   | expression_list expression SEMICOLON
                     { cout << $2 << endl: }:</pre>
expression := expression PLUS expression
               \{ \$\$ = \$1 + \$3; \}
             | expression TIMES expression
               \{ \$\$ = \$1 * \$3 : \}
             | LEFT_PAREN expression RIGHT_PAREN
               \{ \$\$ = \$2; \}
             | INT_NUMBER
               { \$\$ = \$1; };
```

Parsing driver

The class ParsingDriver has the following roles:

- It opens the mod file and launches the lexical and syntaxic analyzers on it
- It implements most of the semantic actions of the grammar
- By doing so, it creates an object of type ModFile, which is the data structure representing the mod file
- Or, if there is a parsing error (unknown keyword, undeclared symbol, syntax error), it displays the line and column numbers where the error occurred and exits

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The ModFile class

- This class is the internal data structure used to store all the information contained in a mod file
- One instance of the class represents one mod file
- The class contains the following elements (as class members):
 - ▶ a symbol table, numerical constants table, external functions table
 - trees of expressions: dynamic model, static model, original model, ramsey dynamic model, steady state model, trend dynamic model, ...
 - the list of the statements (parameter initializations, shocks block, check, steady, simul, ...)
 - model-specification and user-preference variables: block, bytecode, use_dll, no_static, ...
 - ▶ an evaluation context (containing initval and parameter values)
- An instance of ModFile is the output of the parsing process (return value of ParsingDriver::parse())

The symbol table (1/3)

- A symbol is simply the name of a variable (endogenous, exogenous, local, auxiliary, etc), parameter, external function, ... basically everything that is not recognized as a Dynare keyword
- SymbolTable is a simple class used to maintain the list of the symbols used in the mod file
- For each symbol, it stores:
 - its name, tex_name, and long_name (strings, some of which can be empty)
 - its type (an enumerator defined in CodeInterpreter.hh)
 - a unique integer identifier (also has a unique identifier by type)

The symbol table (2/3)

Existing types of symbols:

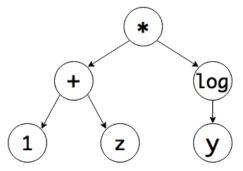
- Endogenous variables
- Exogenous variables
- Exogenous deterministic variables
- Parameters
- Local variables inside model: declared with a pound sign (#) construction
- Local variables outside model: no declaration needed (e.g. lhs symbols in equations from steady_state_model block, expression outside of model block, ...)
- External functions
- Trend variables
- Log Trend variables
- Unused Endogenous variables (created when nostrict option is passed)

The symbol table (3/3)

- Symbol table filled in:
 - using the var, varexo, varexo_det, parameter, external_function, trend_var, and log_trend_var declarations
 - ▶ using pound sign (#) constructions in the model block
 - on the fly during parsing: local variables outside models or unknown functions when an undeclared symbol is encountered
 - during the creation of auxiliary variables in the transform pass
- Roles of the symbol table:
 - permits parcimonious and more efficient representation of expressions (no need to duplicate or compare strings, only handle a pair of integers)
 - ensures that a given symbol is used with only one type

Expression trees (1/3)

- The data structure used to store expressions is essentially a tree
- Graphically, the tree representation of $(1 + z) * \log(y)$ is:



- No need to store parentheses
- Each circle represents a node
- A non external function node has at most one parent and at most three children (an external function node has as many children as arguments)

Expression trees (2/3)

- A tree node is represented by an instance of the abstract class ExprNode
- This class has 5 sub-classes, corresponding to the 5 types of non-external-function nodes:
 - NumConstNode for constant nodes: contains the identifier of the numerical constants it represents
 - VariableNode for variable/parameters nodes: contains the identifier of the variable or parameter it represents
 - ▶ UnaryOpNode for unary operators (e.g. unary minus, log, sin): contains an enumerator representing the operator, and a pointer to its child
 - ▶ BinaryOpNode for binary operators (e.g. +, *, pow): contains an enumerator representing the operator, and pointers to its two children
 - TrinaryOpNode for trinary operators (e.g. normcdf, normpdf): contains an enumerator representing the operator and pointers to its three children

Expression trees (3/3)

- The abstract class ExprNode has an abstract sub-class called AbstractExternalFunctionNode
- This abstract sub-class has 3 sub-classes, corresponding to the 3 types of external function nodes:
 - ExternalFunctionNode for external functions. Contains the identifier
 of the external function and a vector of its arguments
 - FirstDerivExternalFunctionNode for the first derivative of an external function. In addition to the information contained in ExternalFunctionNode, contains the index w.r.t. which this node is the derivative.
 - ► SecondDerivExternalFunctionNode for the second derivative of an external function. In addition to the information contained in FirstDerivExternalFunctionNode, contains the index w.r.t. which this node is the second derivative.

Classes DataTree and ModelTree

- Class DataTree is a container for storing a set of expression trees
- Class ModelTree is a sub-class container of DataTree, specialized for storing a set of model equations.
- In the code, we use ModelTree-derived classes: DynamicModel (the model with lags) and StaticModel (the model without lags)
- Class ModFile contains:
 - one instance of DataTree for storing all expressions outside model block
 - several instances of DynamicModel, one each for storing the equations of the model block for the original model, modified model, original Ramsey model, the Ramsey FOCs, etc.
 - one instance of StaticModel for storing the equations of model block without lags
- Expression storage is optimized through three mechanisms:
 - symbolic simplification rules
 - sub-expression sharing
 - pre-computing of numerical constants

Constructing expression trees

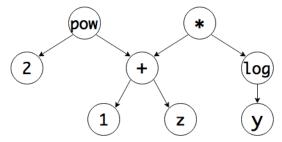
- Class DataTree contains a set of methods for constructing expression trees
- Construction is done bottom-up, node by node:
 - one method for adding a constant node
 (AddPossiblyNegativeConstant(double))
 - one method for a log node (AddLog(arg))
 - one method for a plus node (AddPlus(arg1, arg2))
- These methods take pointers to ExprNode, allocate the memory for the node, construct it, and return its pointer
- These methods are called:
 - from ParsingDriver in the semantic actions associated to the parsing of expressions
 - during symbolic derivation, to create derivatives expressions
 - when creating the static model from the dynamic model
 - **.**...

Reduction of constants and symbolic simplifications

- The construction methods compute constants whenever possible
 - ▶ Suppose you ask to construct the node 1 + 1
 - ► The AddPlus() method will return a pointer to a constant node containing 2
- The construction methods also apply a set of simplification rules, such as:
 - 0 + 0 = 0
 - x + 0 = x
 - ▶ 0 x = -x
 - ▶ -(-x) = x
 - x * 0 = 0
 - ▶ x/1 = x
 - $x^{0} = 1$
- When a simplification rule applies, no new node is created

Sub-expression sharing (1/2)

- Consider the two following expressions: $(1+z)*\log(y)$ and $2^{(1+z)}$
- Expressions share a common sub-expression: 1+z
- The internal representation of these expressions is:



Sub-expression sharing (2/2)

- Construction methods implement a simple algorithm which achieves maximal expression sharing
- Algorithm uses the fact that each node has a unique memory address (pointer to the corresponding instance of ExprNode)
- It maintains 9 tables which keep track of the already-constructed nodes: one table by type of node (constants, variables, unary ops, binary ops, trinary ops, external functions, first deriv of external functions, second deriv of external functions, local variables)
- Suppose you want to create the node $e_1 + e_2$ (where e_1 and e_2 are sub-expressions):
 - ▶ the algorithm searches the binary ops table for the tuple equal to (address of e_1 , address of e_2 , op code of +) (it is the search key)
 - if the tuple is found in the table, the node already exists and its memory address is returned
 - otherwise, the node is created and is added to the table with its search key
- Maximum sharing is achieved because expression trees are constructed bottom-up

Final remarks about expressions

- Storage of negative constants
 - class NumConstNode only accepts positive constants
 - a negative constant is stored as a unary minus applied to a positive constant
 - ▶ this is a kind of identification constraint to avoid having two ways of representing negative constants: (-2) and -(2)
- Widely used constants
 - ▶ class DataTree has attributes containing pointers to constants: 0, 1, 2, -1, NaN, ∞ , $-\infty$, and π
 - these constants are used in many places (in simplification rules, in derivation algorithm...)
 - sub-expression sharing algorithm ensures that these constants will never be duplicated

List of statements

- A statement is represented by an instance of a subclass of the abstract class Statement
- Three groups of statements:
 - initialization statements (parameter initialization with p = ..., initval, histval, or endval block)
 - ▶ shocks blocks (shocks, mshocks, ...)
 - computing tasks (steady, check, simul, ...)
- Each type of statement has its own class (e.g. InitValStatement, SimulStatement,...)
- The class ModFile stores a list of pointers of type Statement*, corresponding to the statements of the mod file, in their order of declaration
- Heavy use of polymorphism in the check pass, computing pass, and when writing outputs: abstract class Statement provides a virtual method for these 3 actions

Evaluation context

- The ModFile class contains an evaluation context
- It is a map associating a numerical value to some symbols
- Filled in with initval block values and parameter initializations
- Used during equation normalization (in the block decomposition), for finding non-zero entries in the jacobian
- Used in testing that trends are compatible with a balanced growth path, for finding non-zero cross partials of equations with respect to trend variables and endogenous varibales

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Error checking during parsing

- Some errors in the mod file can be detected during parsing:
 - syntax errors
 - use of undeclared symbols in model block, initval block...
 - ▶ use of a symbol incompatible with its type (e.g. parameter in initval, local variable used both in model and outside model)
 - multiple shock declarations for the same variable
- But some other checks can only be done when parsing is completed. . .

Check pass

- The check pass is implemented through the method ModFile::checkPass()
- Performs many checks. Examples include:
 - check there is at least one equation in the model (except if doing a standalone BVAR estimation)
 - checks for coherence in statements (e.g. options passed to statements do not conflict with each other, required options have been passed)
 - checks for coherence among statements (e.g. if osr statement is present, ensure osr_params and optim_weights statements are present)
 - checks for coherence between statements and attributes of mod file (e.g. use_dll is not used with block or bytecode)

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Transform pass (1/2)

- The transform pass is implemented through the method ModFile::transformPass(bool nostrict)
- It makes necessary transformations (notably to the dynamic model, symbol table, and statements list) preparing the ModFile object for the computing pass. Examples of transformations include:
 - creation of auxiliary variables and equations for leads, lags, expectation operator, differentiated forward variables, etc.
 - detrending of model equations if nonstationary variables are present
 - decreasing leads/lags of predetermined variables by one period
 - addition of FOCs of Langrangian for Ramsey problem
 - addition of dsge_prior_weight initialization before all other statements if estimating a DSGE-VAR where the weight of the DSGE prior of the VAR is calibrated

Transform pass (2/2)

- It then freezes the symbol table, meaning that no more symbols can be created on the ModFile object
- Finally checks are performed on the transformed model. Examples include:
 - same number of endogenous varibables as equations (not done in certain situations, e.g. Ramsey, discretionary policy, etc.)
 - correspondence among variables and statements, e.g. Ramsey policy, identification, perfect foresight solver, and simul are incompatible with deterministic exogenous variables
 - correspondence among statements, e.g. for DSGE-VAR without bayesian_irf option, the number of shocks must be greater than or equal to the number of observed variables

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Overview of the computing pass

- Computing pass implemented in ModFile::computingPass()
- Creates Static model from Dynamic (by removing leads/lags)
- Determines which derivatives to compute
- Then calls DynamicModel::computingPass() which computes:
 - leag/lag variable incidence matrix
 - symbolic derivatives w.r.t. endogenous, exogenous, and parameters, if needed
 - equation normalization + block decomposition
 - temporary terms
 - computes equation cross references, if desired
- NB: analagous operations for Static model are performed by StaticModel::computingPass()
- Asserts that equations declared linear are indeed linear (by checking that Hessian == 0)
- Finally, calls Statement::computingPass() on all statements

Model Variables

- In the context of class ModelTree, a variable is a pair (symbol, lag)
- The symbol must correspond to a variable of type endogenous, exogenous, deterministic exogenous variable, or parameter
- The SymbolTable class keeps track of valid symbols while the variable_node_map keeps track of model variables (symbol, lag pairs stored in VariableNode objects)
- After the computing pass, the DynamicModel class writes the leag/lag incidence matrix:
 - three rows: the first row indicates t-1, the second row t, and the third row t+1
 - one column for every endogenous symbol in order of declaration; NB: includes endogenous auxiliary variables created during the transform pass
 - elements of the matrix are either 0 (if the variable does not appear in the model) or correspond to the variable's column in the Jacobian of the dynamic model

Static versus dynamic model

- The static model is simply the dynamic model without leads and lags
- Static model used to characterize the steady state
- The jacobian of the static model is used in the (MATLAB) solver for determining the steady state

Example

- suppose dynamic model is $2x_t \cdot x_{t-1} = 0$
- static model is $2x^2 = 0$, whose derivative w.r.t. x is 4x
- dynamic derivative w.r.t. x_t is $2x_{t-1}$, and w.r.t. x_{t-1} is $2x_t$
- removing leads/lags from dynamic derivatives and summing over the two partial derivatives w.r.t. x_t and x_{t-1} gives 4x

Which derivatives to compute?

- In deterministic mode:
 - static jacobian w.r.t. endogenous variables only
 - dynamic jacobian w.r.t. endogenous variables only
- In stochastic mode:
 - static jacobian w.r.t. endogenous variables only
 - dynamic jacobian w.r.t. endogenous, exogenous, and deterministic exogenous variables
 - dynamic hessian w.r.t. endogenous, exogenous, and deterministic exogenous variables
 - ▶ possibly dynamic 3rd derivatives (if order option ≥ 3)
 - possibly dynamic jacobian and/or hessian w.r.t. parameters (if identification or analytic derivs needed for estimation and params_derivs_order > 0)
- For Ramsey policy: the same as above, but with one further order of derivation than declared by the user with order option (the derivation order is determined in the check pass, see RamseyPolicyStatement::checkPass())

Derivation algorithm (1/2)

Derivation of the model implemented in

```
ModelTree::computeJacobian(),
ModelTree::computeHessian(),
ModelTree::computeThirdDerivatives(), and
ModelTree::computeParamsDerivatives()
```

- Simply call ExprNode::getDerivative(deriv_id) on each equation node
- Use of polymorphism:
 - ▶ for a constant or variable node, derivative is straightforward (0 or 1)
 - for a unary, binary, trinary op nodes and external function nodes, recursively calls method computeDerivative() on children to construct derivative

Derivation algorithm (2/2)

Optimizations

- Caching of derivation results
 - method ExprNode::getDerivative(deriv_id) memorizes its result in a member attribute (derivatives) the first time it is called
 - ▶ the second time it is called (with the same argument), it simply returns the cached value without recomputation
 - caching is useful because of sub-expression sharing
- Efficiently finds symbolic derivatives equal to 0
 - consider the expression $x + y^2$
 - ▶ without any computation, you know its derivative w.r.t. z is zero
 - each node stores in an attribute (non_null_derivatives) the set of variables which appear in the expression it represents ({x, y} in the example)
 - this set is computed in prepareForDerivation()
 - when getDerivative(deriv_id) is called, immediately returns zero if deriv_id is not in that set

Temporary terms (1/2)

- When the preprocessor writes equations and derivatives in its outputs, it takes advantage of sub-expression sharing
- In MATLAB static and dynamic output files, equations are preceded by a list of temporary terms
- These terms are variables containing expressions shared by several equations or derivatives
- Using these terms greatly enhances the computing speed of the model residual, jacobian, hessian, or third derivative

Temporary terms (2/2)

- Expression storage in the preprocessor implements maximal sharing but this is not optimal for the MATLAB output files, because creating a temporary variable also has a cost (in terms of CPU and of memory)
- Computation of temporary terms implements a trade-off between:
 - cost of duplicating sub-expressions
 - cost of creating new variables
- Algorithm uses a recursive cost calculation, which marks some nodes as being "temporary"
- Problem: redundant with optimizations done by the C/C++ compiler (when Dynare is in DLL mode) ⇒ compilation very slow on big models

The special case of Ramsey policy

- For most statements, the method computingPass() is a no-op...
- ... except for planner_objective statement, which serves to declare planner objective when doing optimal policy under commitment
- Class PlannerObjectiveStatement contains an instance of ModelTree, which stores the objective function (i.e. only one equation in the tree)
- During the computing pass, triggers the computation of the first and second order (static) derivatives of the objective

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Output overview

- Implemented in ModFile::writeOutputFiles()
- If mod file is model.mod, all created filenames will begin with model
- Main output file is model.m, containing:
 - general initialization commands
 - symbol table output (from SymbolTable::writeOutput())
 - lead/lag incidence matrix (from DynamicModel::writeDynamicMFile())
 - call to MATLAB functions corresponding to the statements of the mod file (written by calling Statement::writeOutput() on all statements through polymorphism)
- Subsidiary output files:
 - one for the static model
 - one for the dynamic model
 - one for the auxiliary variables
 - one for the steady state file (if relevant)
 - one for the planner objective (if relevant)

Model output files

Three possible output types:

- MATLAB/Octave mode: static and dynamic files in MATLAB
- Julia mode: static and dynamic files in Julia
- DLL mode:
 - static and dynamic files in C++ source code (with corresponding headers)
 - compiled through mex to allow execution from within MATLAB
- Sparse DLL mode:
 - static file in MATLAB
 - two possibilities for dynamic file:
 - ★ by default, a C++ source file (with header) and a binary file, to be read from the C++ code
 - or, with no_compiler option, a binary file in custom format, executed from MATLAB through simulate DLL
 - the second option serves to bypass compilation of C++ file which can be very slow

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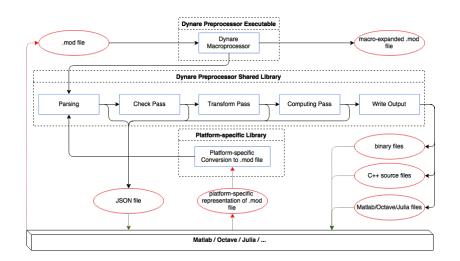
Proposed changes with addition of Julia support (1/2)

- Julia output is provided upon parsing of mod file, everything else done in Julia
 - Pros: very few changes to the preprocessor
 - Cons: repeated code (same checks, transformations, computations done in preprocessor and Julia); potential code divergence/two parallel projects
- Oump preprocessor altogether: do everything with Julia
 - Pros: simple to distribute, move away from C++ (no contributions, requires more expertise)
 - Cons: MATLAB/Octave users must also download Julia, a big project, speed (?)

Proposed changes with addition of Julia support (2/2)

- Oreate libraries out of the preprocessor
 - ▶ Pros: Dynare interaction similar across HLPs, preprocessor used as is
 - ► Cons: difficult for outsiders to contribute, big project, not much benefit in speed when compared to...
- Write mod file from HLP then call preprocessor; option to output JSON file representing ModFile object at every step of the preprocessor
 - Pros: Dynare interaction similar across HLPs, preprocessor used as is, minimal amount of work, easy incremental step, allows users to support any given HPL given the JSON output
 - ► Cons: unnecessary processing when certain changes made in host language, keeps defaults of current preprocessor, speed (?)
- Other ideas?

Using HLP mod file objects (1/2)



Using HLP mod file objects (2/2)

- Allows interactivity for all HLPs; requires only
 - A definition of a mod file class in the HLP
 - ▶ A library function that converts an HLP mod file object to a mod file
- Allows users to use Dynare with any HPL. Standard JSON output can be read in any HPL; user can use it construct desired HPL objects and work with model in their language of preference
- Easy first step
- No divergence of codebase: don't need to repeat code (checks, transformations, etc.) across platforms
- Creates mod files that can be used on other host language platforms
- Adds one more HLP library to distribute
- Need to design/implement classes that will store processed dynare mod file in various HLPs