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Enhancement of the OpenModelica Compiler – Analytical calculation of the Jacobian matrix

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OpenProd - 01|SO9029C

Overview

1. Differential Algebraic Equation System (DAE)
2. Numerical Integration - DASSL
3. Integration of the Jacobian Matrix
4. Test and Results
5. Outlook

1. Differential Algebraic Equation System (DAE)

```
model simpleCircuit
```

```
    Modelica.Electrical.Analog.Basic.Resistor R1
```

```
    Modelica.Electrical.Analog.Basic.Resistor R2
```

```
    Modelica.Electrical.Analog.Basic.Capacitor C
```

```
    Modelica.Electrical.Analog.Basic.Ground G
```

```
    Modelica.Electrical.Analog.Sources.SineVoltage AC
```

```
equation
```

```
    connect(R1.p, R2.n)
```

```
    connect(R1.p, C.p)
```

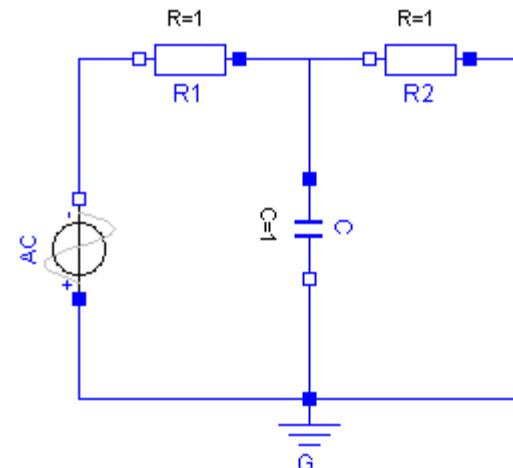
```
    connect(AC.n, R1.n)
```

```
    connect(AC.p, G.p)
```

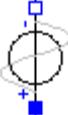
```
    connect(C.n, G.p)
```

```
    connect(R2.p, G.p)
```

```
end simpleCircuit;
```



1. Differential Algebraic Equation System (DAE)

AC 	<ol style="list-style-type: none"> 1.) $0 = AC.p.i + AC.n.i$ 2.) $AC.v = AC.p.v - AC.n.v$ 3.) $AC.i = AC.p.i$ 4.) $AC.v = AC.VA * \sin(2 * AC.PI * AC.f * time)$ 	R1 	<ol style="list-style-type: none"> 1.) $0 = R1.p.i + R1.n.i$ 2.) $R1.v = R1.p.v - R1.n.v$ 3.) $R1.i = R1.p.i$ 4.) $R1.v = R1.R * R1.i$
C 	<ol style="list-style-type: none"> 1.) $0 = C.p.i + C.n.i$ 2.) $C.v = C.p.v - C.n.v$ 3.) $C.i = C.p.i$ 4.) $C.i = C.C * \text{der}(C.v)$ 	R2 	<ol style="list-style-type: none"> 1.) $0 = R2.p.i + R2.n.i$ 2.) $R2.v = R2.p.v - R2.n.v$ 3.) $R2.i = R2.p.i$ 4.) $R2.v = R2.R * R2.i$
G 	$G.p.v = 0$		
wires	<ol style="list-style-type: none"> 1.) $R1.p.v = R2.n.v$ 2.) $R1.p.v = C.p.v$ 3.) $AC.n.v = R1.n.v$ 4.) $AC.p.v = G.p.v$ 5.) $C.n.v = G.p.v$ 6.) $R2.p.v = G.p.v$ 	flow at node	<ol style="list-style-type: none"> 1.) $0 = AC.n.i + R1.n.i$ 2.) $0 = R2.p.i + R2.n.i + C.p.i$ 3.) $0 = R1.p.i + G.p.i + C.n.i + AC.p.i$

1. Differential Algebraic Equation System (DAE)

10 equations

$$(1) \quad R1.v = (-R1.R) * R1.n.i$$

$$(2) \quad R1.v = C.p.v - R1.n.v$$

$$(3) \quad R2.v = (-R2.R) * R2.n.i$$

$$(4) \quad R2.v = -C.p.v$$

$$(5) \quad -C.n.i = C.C * \text{der}(C.v)$$

$$(6) \quad C.v = C.p.v$$

$$(7) \quad AC.y = A * \sin(2 * \pi * f * t + \varphi)$$

$$(8) \quad AC.y = -R1.n.v$$

$$(9) \quad 0.0 = R1.n.i + (C.n.i + G.p.i - R2.n.i)$$

$$(10) \quad 0.0 = R2.n.i - C.n.i - R1.n.i$$

10 variables

$$(1) \quad AC.y$$

$$(2) \quad G.p.i$$

$$(3) \quad C.n.i$$

$$(4) \quad C.p.v$$

$$(5) \quad C.v$$

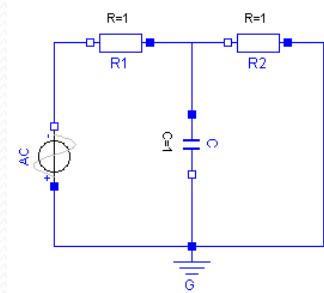
$$(6) \quad R2.n.i$$

$$(7) \quad R2.v$$

$$(8) \quad R1.n.i$$

$$(9) \quad R1.n.v$$

$$(10) \quad R1.v$$



1. Differential Algebraic Equation System (DAE)

General representation of DAEs

$$0 = \underline{f}(t, \dot{\underline{x}}(t), \underline{x}(t), \underline{y}(t), \underline{u}(t), \underline{p})$$

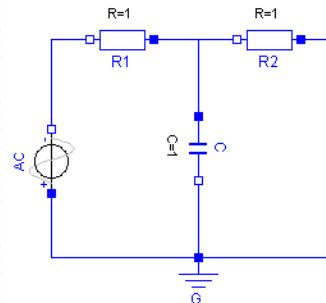
t	time
$\dot{\underline{x}}(t)$	vector of differentiated state variables
$\underline{x}(t)$	vector of state variables
$\underline{y}(t)$	vector of algebraic variables
$\underline{u}(t)$	vector of input variables
\underline{p}	vector of parameters and/or constants

1. Differential Algebraic Equation System (DAE)

General representation - Example

$$\underline{p} = \begin{pmatrix} R1.R \\ R2.R \\ C.C \\ AC.offset \\ AC.startTime \\ AC.amplitude \\ AC.freqHZ \\ AC.phase \end{pmatrix} \quad \underline{y}(t) = \begin{pmatrix} R1.n.i \\ R1.v \\ R1.n.v \\ R2.n.i \\ R2.v \\ C.n.i \\ C.p.v \\ AC.y \\ G.p.i \end{pmatrix}$$

$x(t) = (C.v)$
 $\dot{x}(t) = (\dot{C}.v)$



1. Differential Algebraic Equation System (DAE)

Symbolic Transformation to State Space Form

$$\begin{aligned} \underline{0} &= \underline{f}(t, \dot{\underline{x}}(t), \underline{x}(t), \underline{y}(t), \underline{u}(t), \underline{p}) \\ &\quad \downarrow \\ \underline{0} &= \underline{f}(t, \underline{z}(t), \underline{x}(t), \underline{u}(t), \underline{p}), \quad \underline{z}(t) = \begin{pmatrix} \dot{\underline{x}}(t) \\ \underline{y}(t) \end{pmatrix} \\ &\quad \downarrow \\ \underline{z}(t) &= \begin{pmatrix} \dot{\underline{x}}(t) \\ \underline{y}(t) \end{pmatrix} = \underline{g}(t, \underline{x}(t), \underline{u}(t), \underline{p}) \\ &\quad \downarrow \\ \dot{\underline{x}}(t) &= \underline{h}(t, \underline{x}(t), \underline{u}(t), \underline{p}) \\ \underline{y}(t) &= \underline{k}(t, \underline{x}(t), \underline{u}(t), \underline{p}) \end{aligned}$$

1. Differential Algebraic Equation System (DAE)

State Space Form - Example

$$(1) \quad AC.y = A * \sin(2 * \pi * f * t + \phi)$$

$$(2) \quad R1.n.v = -AC.y$$

$$(3) \quad C.p.v = C.v$$

$$(4) \quad R2.v = -C.p.v$$

$$(5) \quad R2.n.i = -R2.v / R2.R$$

$$(6) \quad R1.v = C.p.v - R1.n.v$$

$$(7) \quad R1.n.i = -R1.R / R1.v$$

$$(8) \quad C.n.i = R2.n.i - R1.n.i$$

$$(9) \quad \dot{C}.v = -C.n.i / C.C$$

$$(10) \quad G.p.i = R2.n.i - C.n.i - R1.n.i$$

$$\underline{\dot{x}(t)} = (\dot{C}.v)$$

$$\underline{y(t)} = \begin{pmatrix} R1.n.i \\ R1.v \\ R1.n.v \\ R2.n.i \\ R2.v \\ C.n.i \\ C.p.v \\ AC.y \\ G.p.i \end{pmatrix}$$

2. Numerical Integration – DASSL

Solution Method – Explicit Euler (*forward Euler*)

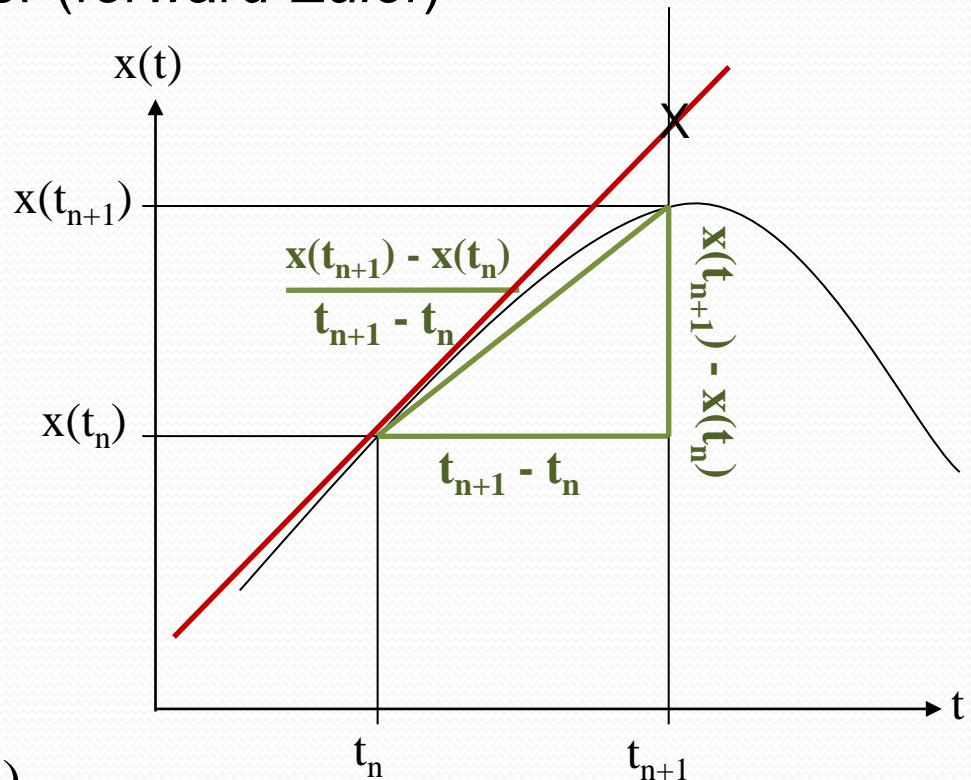
$$\dot{x}(t) = f(t, x(t)) \quad x(t_0) = x_0$$

Numerical approximation
for the derivative

$$\dot{x}(t_n) \approx \frac{x(t_{n+1}) - x(t_n)}{t_{n+1} - t_n} \approx f(t_n, x(t_n))$$

giving an approximation
of x at time $t+1$

$$x(t_{n+1}) \approx x(t_n) + (t_{n+1} - t_n) \cdot f(t_n, x(t_n))$$



2. Numerical Integration – DASSL

Solution Method – Implicit Euler (*backward Euler*)

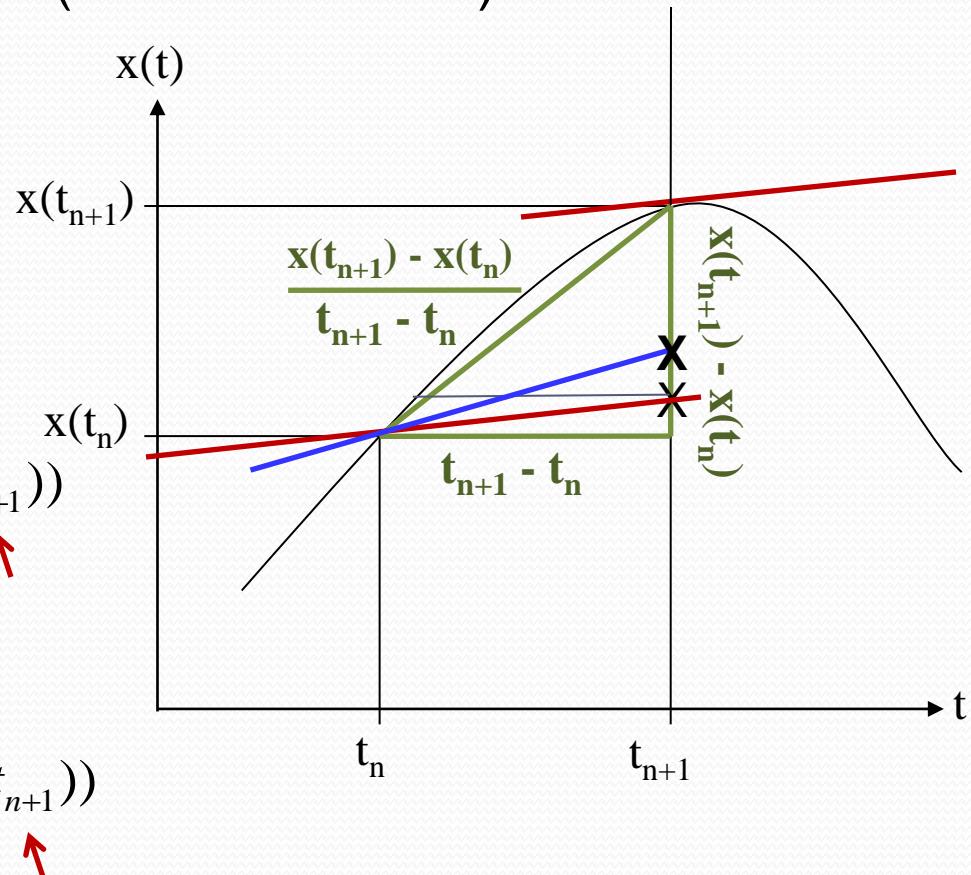
$$\dot{x}(t) = f(t, x(t)) \quad x(t_0) = x_0$$

Numerical approximation
for the derivative

$$\dot{x}(t_{n+1}) \approx \frac{x(t_{n+1}) - x(t_n)}{t_{n+1} - t_n} \approx \frac{x(t_{n+1}) - x(t_n)}{t_{n+1} - t_n} \cdot f(t_{n+1}, x(t_{n+1}))$$

Solve for $x(t_{n+1})$

$$x(t_{n+1}) \approx x(t_n) + (t_{n+1} - t_n) \cdot f(t_{n+1}, x(t_{n+1}))$$



2. Numerical Integration – DASSL

Using explicit and implicit Euler as a predictor-corrector pair

$$\underline{x}_{n+1}^{pred} \approx \underline{x}_n + (t_{n+1} - t_n) \cdot \underline{f}(t_n, \underline{x}_n)$$

$$\underline{x}_{n+1} \approx \underline{x}_n + (t_{n+1} - t_n) \cdot \underline{f}(t_{n+1}, \underline{x}_{n+1}^{pred})$$

Here: one iteration of the corrector

2. Numerical Integration – DASSL

Solution Method – DASSL

$$0 = \underline{f}(t, \underline{x}(t), \dot{\underline{x}}(t)) \quad \underline{x}(t_0) = \underline{x}_0$$

Evaluate a *predictor polynomial* for an initial guess for $\dot{x}_{n+1}^{(0)}, x_{n+1}^{(0)}$

Approximation for the derivative (*corrector equation*)

$$0 = \underline{f}\left(t_{n+1}, \underline{x}_{n+1}, \dot{x}_{n+1}^{(0)} - \frac{\alpha_s}{h_{n+1}}(\underline{x}_{n+1} - x_{n+1}^{(0)})\right) \quad \alpha_s = -\sum_{j=1}^k \frac{1}{j} \quad \text{„fixed leading coefficient“}$$

2. Numerical Integration – DASSL

$$0 = \underline{f} \left(t_{n+1}, \underline{x}_{n+1}, \dot{x}_{n+1}^{(0)} - \frac{\alpha_s}{h_{n+1}} (\underline{x}_{n+1} - x_{n+1}^{(0)}) \right) \quad \alpha_s = - \sum_{j=1}^k \frac{1}{j} \quad \text{„fixed leading coefficent“}$$

Simpler Notation

$$0 = \underline{f}(t_{n+1}, \underline{x}_{n+1}, \alpha \cdot \underline{x}_{n+1} + \beta)$$

$$\alpha = -\frac{\alpha_s}{h_{n+1}} \quad \beta = \dot{x}_{n+1}^{(0)} - \alpha \cdot x_{n+1}^{(0)}$$

Solving the corrector equation
using a modified Newton iteration

„Iteration matrix“

$$\underline{x}^{(m+1)} = \underline{x}^{(m)} - cG^{-1} \underline{f}(t, \underline{x}^{(m)}, \alpha \cdot \underline{x}^{(m)} + \beta) \quad G = \alpha \frac{\partial f}{\partial \dot{x}} + \frac{\partial f}{\partial x}$$

2. Numerical Integration – DASSL

Calculation of the iteration matrix

$$G = \alpha \frac{\partial f}{\partial \dot{x}} + \frac{\partial f}{\partial x}$$

- a) using finite differences
 - numerical
 - Calculation of all values in each time step

- b) analytical calculation
 - Evaluation at each time step
 - Information about the sparsity pattern

3. Integration of the Jacobian Matrix

Calculation using Automatic Differentiation (AD)

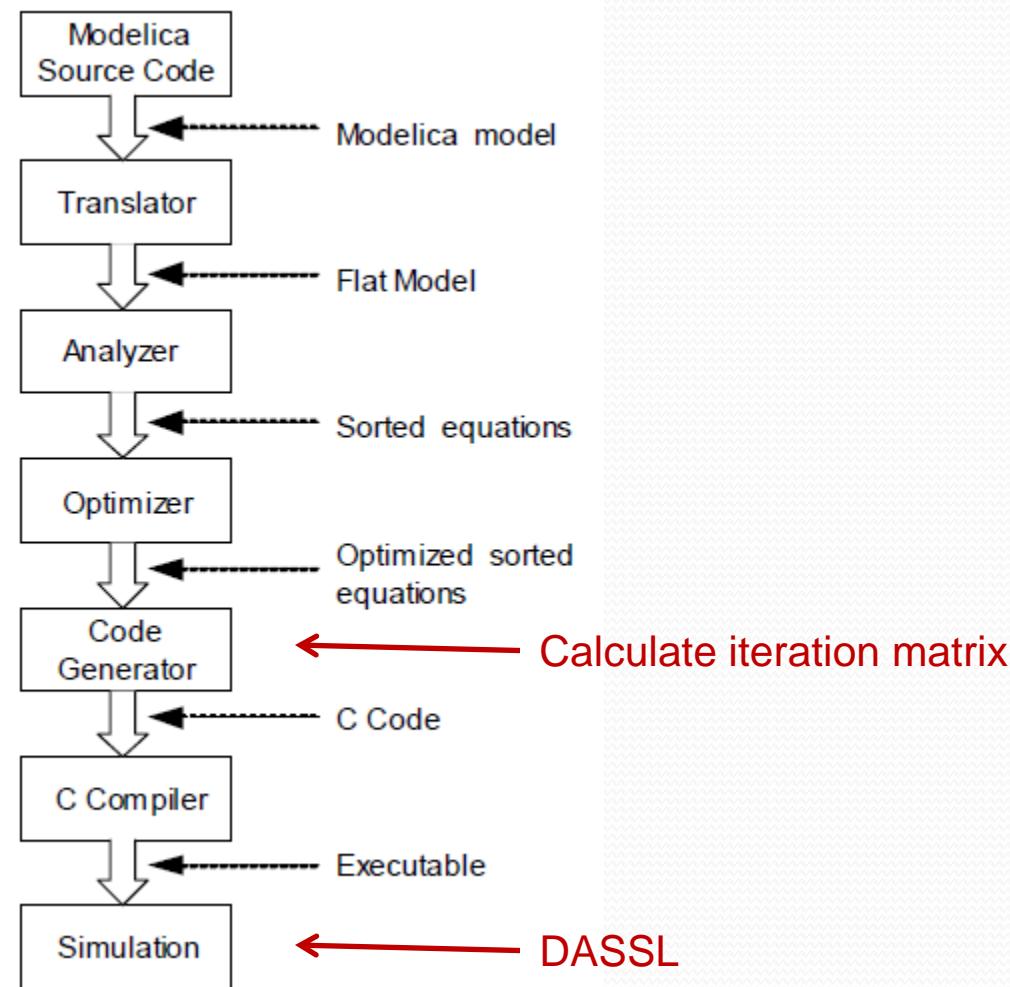
Example:

```
[y1, y2, b] = f(x, a) {  
    b = x  
    y1 = a * sin(b)  
    y2 = b * y1  
}
```



```
[y1, y2, y1', y2', b] = fAD(x, x', a) {  
    b = x  
    b' = 1  
    y1 = a * sin(b)  
    y1' = a * cos(b) * b'  
    y2 = b * y1  
    y2' = b' * y1 + b * y1'  
}
```

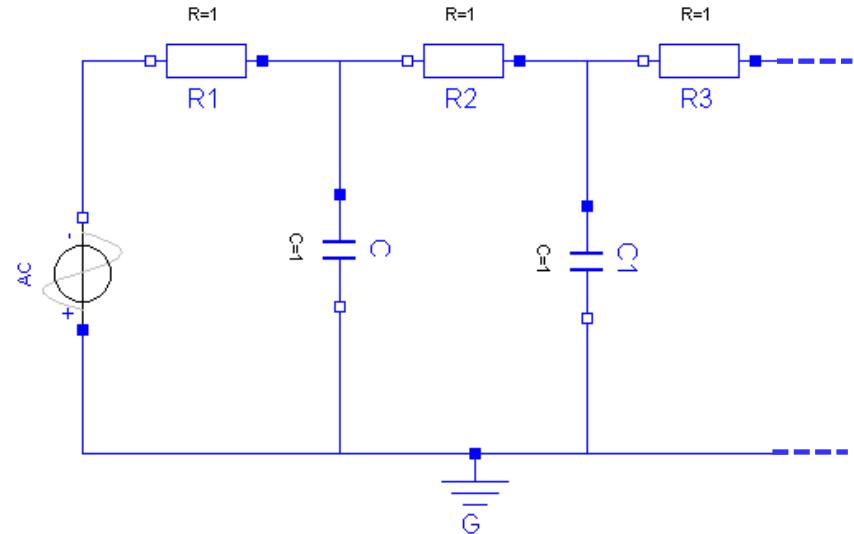
3. Integration of the Jacobian Matrix



4. Test and Results

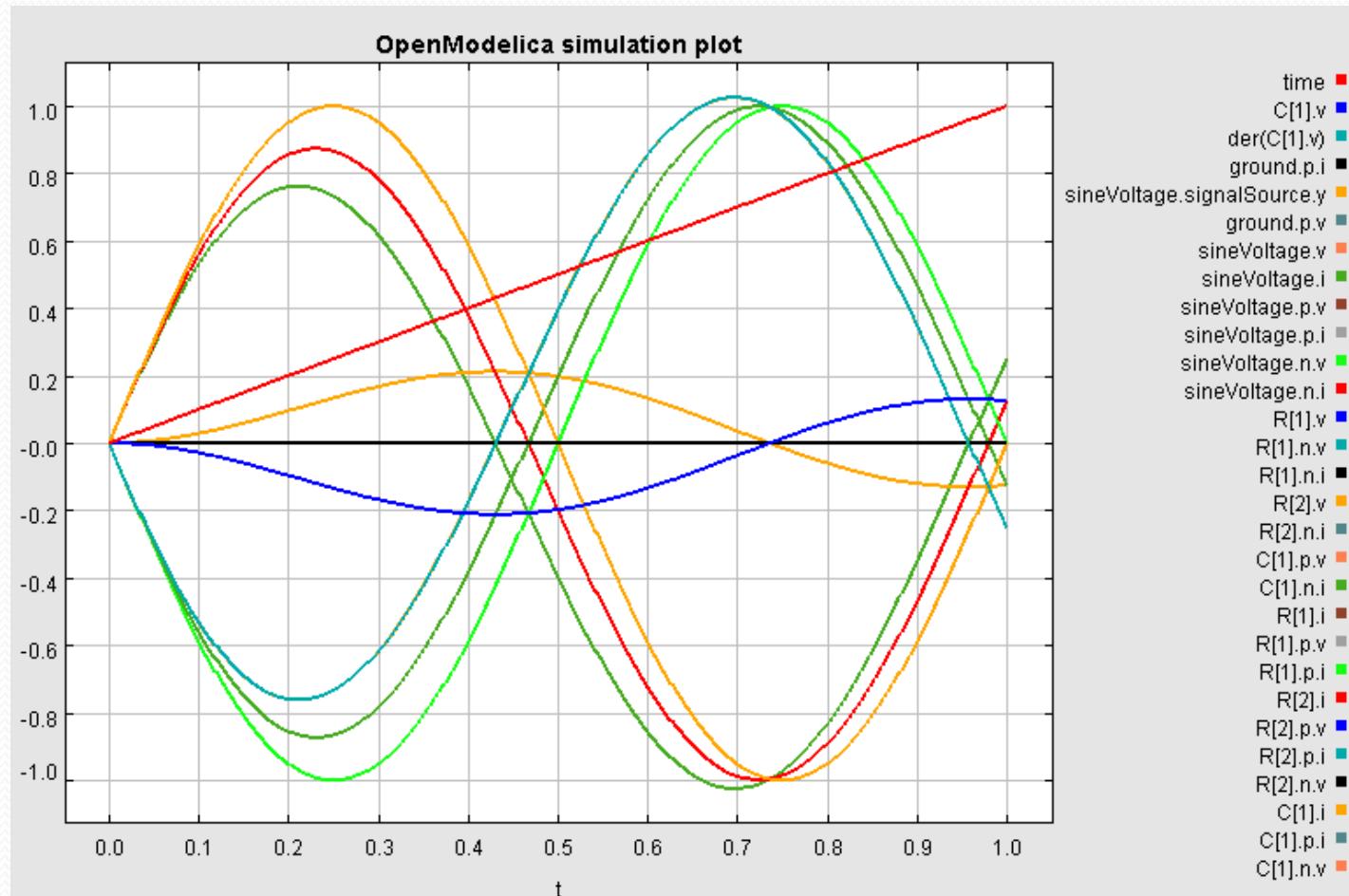
Testmodel:

```
model simpleCircuit
  parameter Integer n=2;
  Modelica.Electrical.Analog.Basic.Resistor R[n];
  Modelica.Electrical.Analog.Basic.Capacitor C[n-1];
  Modelica.Electrical.Analog.Basic.Ground ground;
  Modelica.Electrical.Analog.Sources.SineVoltage sineVoltage;
equation
  for i in 1:n-1 loop
    connect(R[i].p, R[i + 1].n);
    connect(R[i].p, C[i].p);
    connect(C[i].n, ground.p);
  end for;
  connect(sineVoltage.n, R[1].n);
  connect(R[n].p, ground.p);
  connect(sineVoltage.p, ground.p);
end simpleCircuit ;
```



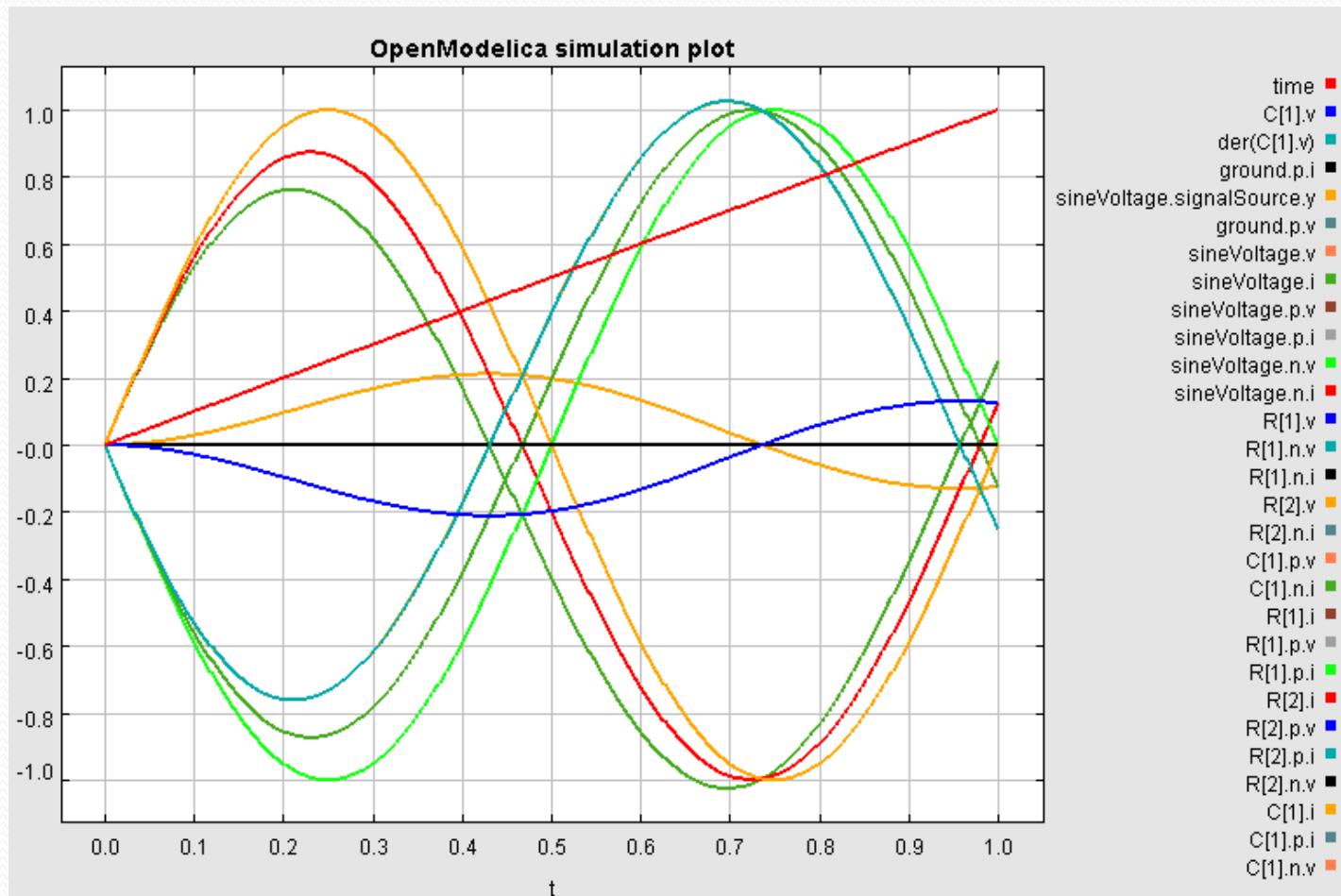
4. Test and Results

Result plot using Finite Differences

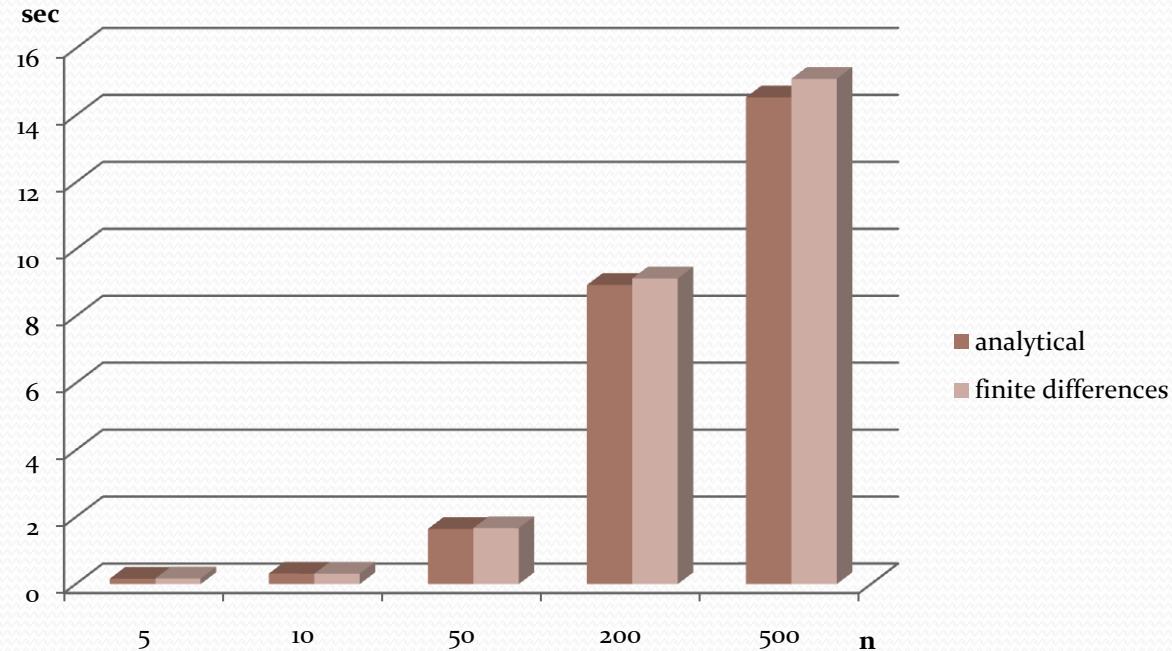


4. Test and Results

Result plot using analytical calculation



4. Test and Results



5. Outlook

- Use sparsity pattern information
- Handle algebraic loops
- In case of external functions: Finite differences only for the variables concerning these functions

Further advantages

- sensitivity analysis
- eigenvalue analysis
- parameter identification
- linearization of non-linear systems
- selection of efficient numerical solution methods (e.g. inline-integration)