# Building interactive applications with ETS

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#### **About the Tutorial**

#### Intended Audience

Use Python to build interactive desktop applications

#### Goal: Successful participants will be able to

 Start using Enthought Tool Suite (ETS) to build non-trivial applications



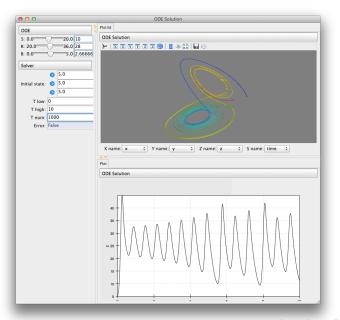


#### Outline

- Introduction
  - ODE 101
- Traits
- TraitsUI
- 4 Chaco
- Mayavi
- Putting it all together
- Note on Envisage
- Summary









# Approach

- A graphical explorer for ODEs from the ground up
- Support arbitrary 2 and 3 dimensional systems
- Using ETS





# Why?

- Something interesting and concrete
- Same ideas extend to other situations



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#### **ODE** 101

- Used to model many systems
  - Physics, astronomy
  - Geology (weather modeling)
  - Chemistry (reactions)
  - Biology
  - Ecology/population modeling
  - Economics (stock trends, interest rates etc.)
- Rich behavior
- Numerical solution: scipy





# Simple equation

$$\frac{dx}{dt} = f(x, t) \tag{1}$$

*x* can be a vector with many components.



# Solving ODEs using SciPy

- Consider the spread of an epidemic in a population
- $\frac{dy}{dt} = ky(L y)$  gives the spread of the disease
- L is the total population.
- Use L = 2.5E5, k = 3E 5, y(0) = 250
- Define a function as below

```
In []: from scipy.integrate import odeint
In []: def epid(y, t):
          k = 3.0e-5
         L = 2.5e5
  . . . .
  \dots return k*y*(L-y)
```



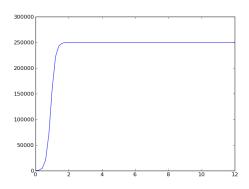


# Solving ODEs using SciPy ...

```
In []: t = linspace(0, 12, 61)
In []: y = odeint(epid, 250, t)
In []: plot(t, y)
```



## Result







# Lorenz equation example

$$\frac{dx}{dt} = s(y-x)$$

$$\frac{dy}{dt} = rx - y - xz$$

$$\frac{dz}{dt} = xy - bz$$

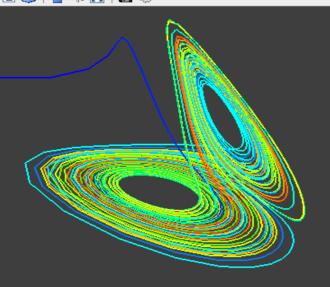
- Specifies the evolution of the system
- Think: Velocity of a particle in 3D
- Lets trace its path



### Solution

```
import numpy as np
from scipy.integrate import odeint
def lorenz(r, t s=10.,r=28., b=8./3.):
   x, y, z = r
   u = s*(y-x)
   v = r*x - y - x*z
   w = x * y - b * z
    return np.array([u, v, w])
start = (10., 50., 50.)
t = np.linspace(0., 50., 2000)
r = odeint(lorenz, start, t)
x, y, z = r[:,0], r[:,1], r[:,2]
mlab.plot3d(x, y, z, t,
from mayavi import mlab
                tube_radius=None)
```





#### Now what?

- An application to explore these
- Use cases
  - Interactive exploration
  - Change the equations on UI
  - See output immediately
  - Standard equations (fully setup)





# ETS: Enthought Tool Suite

- Traits: Object Models
- TraitsUI: Views for Objects having Traits
- Chaco: 2D Visualizations
- Mayavi: 3D Visualizations
- Envisage: Application Framework

Miscellaneous libraries



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#### Introduction to Traits

trait: Python object attribute with additional characteristics

- http://code.enthought.com/projects/ traits
- http://github.enthought.com/traits/ tutorials



#### Trait features

- Initialization: default value
- Validation: strongly typed
- Delegation: value delegation
- Notification: events
- Visualization: MVC, automatic GUI!





### Traits Example

```
from traits.api import (Delegate, HasTraits,
    Instance, Int, Str)
class Parent(HasTraits):
    # INITIALIZATION: 'last_name' initialized to ''
    last name = Str('')
    age = Int
    father = Instance(Parent)
    last name = Delegate('father')
    def age_changed(self, old, new):
        print 'Age changed from %s to %s ' % (old, new)
```

### Traits Example

```
from traits.api import (Delegate, HasTraits,
    Instance, Int, Str)
class Parent(HasTraits):
    # INITIALIZATION: 'last name' initialized to ''
    last name = Str('')
class Child(HasTraits):
    age = Int
    # VALIDATION: 'father' must be Parent instance
    father = Instance(Parent)
    # DELEGATION: 'last_name' delegated to father's
    last name = Delegate('father')
    # NOTIFICATION: Method called when 'age' changes
    def age_changed(self, old, new):
        print 'Age changed from %s to %s ' % (old, new)
```

### Traits Example

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```
In []: joe = Parent()
In []: joe.last_name = 'Johnson'
In []: moe = Child()
In []: moe.father = joe
In []: moe.last name # Delegation
Out[]: "Johnson"
In []: moe.age = 10 # Notification
Age changed from 0 to 10
In []: moe.configure traits() # Visualization
```

## **Predefined Trait Types**

- Standard: Bool, Int, Float, Str, Tuple, List, Dict
- Constrained: Range, Regex, Expression, ReadOnly
- Special: Either, Enum, Array, File, Color, Font
- Generic: Instance, Any, Callable
- ...
- Custom traits: 2D/3D plots etc.

## Trait Change Notifications

- Static: def \_<trait\_name>\_changed()
- Decorator:
   @on\_trait\_change('extended.trait[].name')
- Dynamic:

# Notification Example

```
class Parent(HasTraits):
   last name = Str('')
class Child(HasTraits):
   age = Int
   father = Instance(Parent)
   def age_changed(self, old, new):
       print 'Age changed from %s to %s ' % (old, new)
def handler(obj, name, old, new):
   print obj, name, old, new
c = Child(father=Parent(last name='Ram'))
```

## Notification Example

```
class Parent(HasTraits):
    last name = Str('')
class Child(HasTraits):
    age = Int
    father = Instance(Parent)
    def _age_changed(self, old, new):
        print 'Age changed from %s to %s ' % (old, new)
    @on trait change('father.last name')
    def dad name updated(self):
        print self.father.last name
def handler(obj, name, old, new):
    print obj, name, old, new
c = Child(father=Parent(last name='Ram'))
c.on trait change(handler, ['father', 'age'])
```

# Designing the ODE explorer app

#### Think!

Focus on the object model





# Designing the ODE explorer app

Think!

Focus on the object model



26 / 77

# Object model

- A class to represent the equation and parameters
- A class for the ODE solution
- Make sure it works TDD



## Lorenz Equation

```
import numpy as np
from traits.api import HasTraits, Float
class LorenzEquation(HasTraits):
    s = Float(10)
    r = Float(28)
    b = Float(8./3)
    def eval(self, X, t):
        x, y, z = X[0], X[1], X[2]
        u = self.s*(y-x)
        v = self.r*x - y - x*z
        w = x*y - self.b*z
        return np.array([u, v, w])
```

### Generalizing the ODE Equation model

```
from traits.api import (Either, HasTraits, List,
    Str)
class ODE(HasTraits):
    """ An ODE of the form dX/dt = f(X)
    name = Str
    vars = Either(List(Str), Str,
                   desc='The names of variables')
    def eval(self, X, t):
        """ Evaluate the derivative, f(X).
        11 11 11
        raise NotImplementedError
```

### Lorenz Equation as an ODE Subclass

```
class LorenzEquation(ODE):
    name = 'Lorenz Equation'
    vars = ['x', 'y', 'z']
    s = Float(10)
    r = Float(28)
    b = Float(8./3)
    def eval(self, X, t):
        x, y, z = X[0], X[1], X[2]
        u = self.s*(y-x)
        v = self.r*x - y - x*z
        w = x*y - self.b*z
        return np.array([u, v, w])
```

#### Or . . .

# Solving the ODE: ODESolver

```
class ODESolver(HasTraits):
    ode = Instance(ODE)
    initial state = Either(Float, Array)
    t = Arrav
    solution = Property (Array,
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```

# Solving the ODE: ODESolver

```
class ODESolver(HasTraits):
    ode = Instance(ODE)
    initial state = Either(Float, Array)
    t = Arrav
    solution = Property(Array,
            depends on='initial_state, t, ode')
                                   ◆ロト ◆個ト ◆注ト 注 りへで
```

# Solving the ODE: ODESolver

```
class ODESolver(HasTraits):
    ode = Instance(ODE)
    initial state = Either(Float, Array)
    t = Arrav
    solution = Property(Array,
            depends on='initial state, t, ode')
    @cached_property
    def _get_solution(self):
        return self.solve()
    def solve(self):
        """ Solve the ODE and return the values
        of the solution vector at specified times t.
        11 11 11
        from scipy.integrate import odeint
        return odeint(self.ode.eval, self.initial state,
                       self.t)
```

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# **Testing**

```
class TestLorenzEquation(unittest.TestCase):
    def setUp(self):
        self.ode = LorenzEquation()
        self.solver = ODESolver(ode=self.ode)
        self.solver.initial state = [10.,50.,50.]
        self.solver.t = numpy.linspace(0, 10, 1001)
    def test_eval(self):
        dX = self.ode.eval(self.solver.initial_state, 0.0)
        self.assertAlmostEqual(dX[0], 400)
        self.assertAlmostEqual(dX[1], -270)
        self.assertAlmostEqual(dX[2], 1100/3.)
    def test solve(self):
        soln = self.solver.solution[1,:]
        self.assertAlmostEqual(soln[0], 13.65484958)
        self.assertAlmostEqual(soln[1], 46.64090341)
        self.assertAlmostEqual(soln[2], 54.35797299)
```

### Exercise

### Solve an ODE

Use the given skeleton code of the ODE equation (solve\_ode.py) and the solver. Put them together to get a solution. Print the final solution.

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  - ODE 101
- <sup>2</sup> Traits
- TraitsUI
- 4 Chaco
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### **TraitsUI**

- Implement MVC design pattern
- Create default views for models
- Keep multiple views synced with model
- Create UI with minimal toolkit knowledge





### **Default Traits View**

```
father = Parent(last_name='Joe')
child = Child(age=2, father=father)
child.configure_traits()
```

- Declarative
- Automatic UI creation with configure\_traits()
- Sync with model
- Sync between different views

### **Default Traits View**

```
father = Parent(last_name='Joe')
child = Child(age=2, father=father)
child.configure_traits()
```

- Declarative
- Automatic UI creation with configure\_traits()
- Sync with model
- Sync between different views

# Simplest view

### MVC?

# Views: common parameters

- title: Title of the view
- hind: 'modal', 'live', 'livemodal'
- resizable
- width, height
- buttons: OK. Cancel and other buttons
- id: persists view
- ...and a lot more

# Items: common parameters

- name: name of trait being edited
- label: optional label to use
- style:
   'simple'/'custom'/'readonly'/...
- show\_label: True/False
- help: Help text for item
- editor: Specific editor to use
- defined\_when: expression
- visible\_when: expression
- enabled\_when: expression
- ...

# Groups

- Group, VGroup, HGroup: group of items
- Parameters:
  - label
    - layout:

```
'normal', 'split', 'tabbed', ...
```

- show\_labels: True/False
- defined\_when, ...
- width, height

## Lorenz Equation View

Configure the parameters of the Lorenz equation *s*, *r* and *b* 

```
class LorenzEquation(ODE):
    ...
    view = View(
        Item('s',
            editor=RangeEditor(low=0.0, high=20.0)),
        Item('r',
            editor=RangeEditor(low=20.0, high=36.0)),
        Item('b',
            editor=RangeEditor(low=0.0, high=5.0))
    )
```

### Exercise

### Customize the view for Lorenz equation

Use the existing **solve\_ode.py** file and setup the views for one or more of the classes (as many as you are able).

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### Chaco

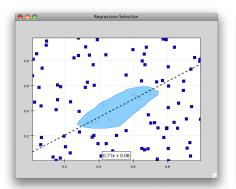
- 2D plotting library
- Embeddable in any wx/Qt application
- Fast and interactive visualizations
- Integrates well with Traits and TraitsUI
- Easily extensible to create new types of plots and interactions

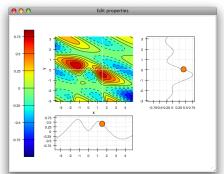




# Chaco Interactive Plotting

http://docs.enthought.com/chaco/user\_manual/annotated\_examples.html









### Core Ideas

- Plots are compositions of visual components
- Separation between data and screen space
- Modular design and extensible classes



# Chaco Architecture Overview

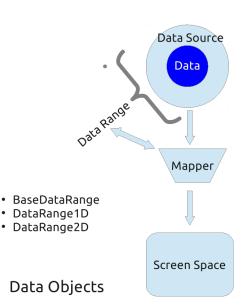
- Data Handling: wrap input data, transform co-ordinates between data and screen space (eg., ArrayDataSource, LinearMapper)
- Visual components: render to the screen (eg.
   LinePlot, ScatterPlot, Legend, PlotAx.
- Tools: handle keyboard or mouse events and modify other components (eg.
   PanTool, ZoomTool, ScatterInspector)



# Simple Plotting with Chaco

```
class LinePlot(HasTraits):
    plot = Instance(Plot)
    traits view = View(
        Item('plot', editor=ComponentEditor(),
             show label=False),
             width=500, height=500,
        resizable=True,
        title="Chaco Plot")
    def _plot_default (self):
        x = linspace(-14, 14, 100)
        y = \sin(x) * x**3
        plotdata = ArrayPlotData(x = x, y = y)
        plot = Plot(plotdata)
        plot.plot(("x", "y"), type="line", color="blue")
        plot.title = "sin(x) * x^3"
        return plot
```

### Chaco Data Model



- ArrayDataSource
- DataContextDataSource
- GridDataSource
- ImageData
- MultiArrayDataSource
- PointDataSource
  - · data\_changed
  - bounds\_changed
  - metadata\_changed
  - Base1DMapper
  - LinearMapper
  - LogMapper
- GridMapper
- PolarMapper

## Commonly used Classes

#### Containers

- → Handle layout
- → Similar to layout grids in GUI toolkits
- Efficient way for event dispatch, since screen space is partitioned logically
  - OverlayPlotContainer
  - HplotContainer
  - VplotContainer
  - GridPlotContainer

#### **Tools**

- Take events from a component and perform actions based on that
  - PanTool
  - ZoomTool

٠ ...

#### Renderers

- → Actually draw a type of plot
  - BarPlot
  - Base2DPlot
  - ContourLinePlot
  - ContourPolyPlot
  - ImagePlot
  - CMapImagePlot
  - LinePlot
  - ErrorBarPlot
  - PolygonPlot
  - FilledLinePlot
  - ScatterPlot
  - ColormappedScatterPlot
  - ColorBar
  - PolarLineRenderer

### Overlays

# Plotting the ODE Solution

The Plot view, plot and the ODE solution. ODE can be obtained from ODESolver, so it can be a property.

```
class ODEPlot(HasTraits):
    """ A 2D plot of ode solution variables.
    plot = Instance(Component)
    # We need to set data when solution changes
   pd = Instance(ArrayPlotData, args=())
    ode = Property(Instance(ODE), depends_on='solver')
    solver = Instance(ODESolver)
    def get ode(self):
        return self.solver and self.solver.ode
```

# Plotting the ODE Solution

We can create a plot using the first solution array.

```
class ODEPlot(HasTraits):
    traits view = View(
            Item('plot', editor=ComponentEditor(),
                 show label=False),
            resizable=True, title="ODE Solution")
    def _plot_default(self):
        self.pd.set_data('index', self.solver.t)
        # Set the first array as value array for plot.
        self.pd.set data('value',
                         self.solver.solution[:,0])
        plot = Plot(self.pd)
        plot.plot(('index', 'value'))
        return plot
```

# Adding some interactivity and labels

#### **Use Chaco Tools**

```
def _plot_default(self):
    ...
    # Add some interactivity to the plots.
    plot.tools.append(ZoomTool(component=plot))
    plot.tools.append(PanTool(component=plot))
    plot.tools.append(TraitsTool(component=plot))
    plot.x_axis.title = 'time'
    plot.y_axis.title = 'x'
    plot.title = self.ode.name
    return plot
```

# Plotting the ODE Solution

We can make the plot react to changes to the solution (changing initial condition etc.)

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# Mayavi

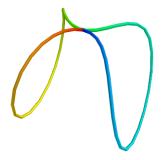
- from mayavi import mlab
- Easy to use
- Uses Traits/TraitsUI heavily
- Can embed 3D plots





# A simple plot

### 1D data



```
>>> from numpy import *
>>> t = linspace(0, 2*pi, 50)
>>> u = cos(t)*pi
>>> x, y, z = sin(u), cos(u), sin(t)
```

>>> mlab.plot3d(x, y, z, t)

# Changing how things look

### Clearing the view

>>> mlab.clf()

### IPython is your friend!

- >>> mlab.points3d?
  - Extra argument: Scalars
  - Keyword arguments
  - UI

# Changing how things look

### Clearing the view

>>> mlab.clf()

### IPython is your friend!

>>> mlab.points3d?

- Extra argument: Scalars
- Keyword arguments
- UI

# Embedding a 3D plot

```
from mayavi.core.ui.api import MayaviScene, \
    MlabSceneModel, SceneEditor
class Plot3D(HasTraits):
    scene = Instance(MlabSceneModel, args=())
    view = View(Item(name='scene',
                     editor=SceneEditor(
                          scene class=MayaviScene),
                      show label=False, resizable=True,
                     height=500, width=500),
                resizable=True)
        X, Y = mgrid[-2:2:100j, -2:2:100j]
        R = 10*sqrt(X**2 + Y**2)
        Z = \sin(R)/R
        self.scene.mlab.surf(X,Y,Z,colormap='gist_earth')
                                    ◆ロト ◆問 → ◆注 > ◆注 > 注 り < ②</p>
```

# Embedding a 3D plot

```
from mayavi.core.ui.api import MayaviScene, \
    MlabSceneModel, SceneEditor
class Plot3D(HasTraits):
    scene = Instance(MlabSceneModel, args=())
    view = View(Item(name='scene',
                     editor=SceneEditor(
                         scene class=MayaviScene),
                     show label=False, resizable=True,
                     height=500, width=500),
                resizable=True)
   @on trait change('scene.activated')
   def generate data(self):
        # Create some data
        X, Y = mgrid[-2:2:100j, -2:2:100j]
        R = 10*sqrt(X**2 + Y**2)
        Z = \sin(R)/R
        self.scene.mlab.surf(X,Y,Z,colormap='gist_earth')
```

### Exercise

#### Add a slider to the UI

Add a Range slider to the above example to change the

R = 10\*sqrt(X\*\*2 + Y\*\*2) to

R = self.factor\*sqrt(X\*\*2 + Y\*\*2) such that the factor can be adjusted.

### Solution

```
from traits.api import Range # <--</pre>
class Plot3D(HasTraits):
    scene = Instance(MlabSceneModel, args=())
    factor = Range (0.0, 20.0, 10.0) \# <--
    view = View(Item(name='scene',
                       # ...
                 Item(name='factor'), # <--</pre>
                 resizable=True)
   @on_trait_change('scene.activated, factor') # <--</pre>
   def generate_data(self):
        # ...
```

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## The application

- Easy to put this together
- Exercise for you!

Hint: Compose various views using InstanceEditor with 'custom' style!



#### Exercise

#### **ODE** application

Given the existing code, in **solve\_ode.py** and **embed\_3d\_ex.py** create a UI for the Lorenz equation along with the solver and a 3D or 2D plot.

#### So what?

- Focus on the object model
- Solve the actual problem
- Model separation
- Easy to "wire-up"
- UI is mostly declarative





What next?

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## Envisage

- Extensible framework
- Plugins
- ExtensionPoints
- Extensions
- Similar to Eclipse





## Application frameworks ...

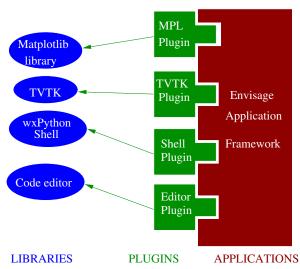
#### Central idea

- Developer focuses on making a clean library
- Framework API specifies how different pieces of the app interact
- Plugin writer exposes the library or objects involved into the framework
- Application writer uses plugins to create new application easily





## Application frameworks ...



END USER





## Big picture

#### Application and plugins

- Envisage application: given a list of plugins
- Plugins setup their contributions
- Application starts: all plugins are started
- Plugins add their capabilties to the app
- Application stops: all plugins are stopped





## Big picture

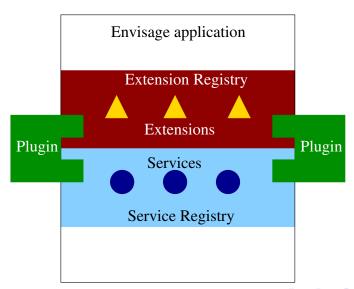
#### Interaction/communication between plugins

- Plugins define extension points
- Extensions → extension points
- Services
  - Well known/shared objects
  - Can be registered and looked-up with the application





# **Envisage application**







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## Summary

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