



Course overview:

- Models in the life sciences
- Software to formulate and solve models

Review of some mathematical tools:

- Linear dependence

- Living entities exhibit:
 - **Spatial organization**, they are separated from their environment
 - **Metabolism**, they undergo internal physico-chemical processes
 - **Homeostasis**, they maintain a quasi-stable internal state
 - **Reproduction**, they produce copies of themselves, perhaps mutated
 - **Adaptation**, favorable mutations multiply more rapidly, they evolve
 - **Stimuli response**, internal changes occur upon environment modification
- All the above exhibit regularity, and are therefore the object of scientific study
- Mathematical biology seeks development of well-formulated models to answer biological questions



- Biology identifies populations of distinct species that interact, e.g., predation
- Biological question: what are stable populations of predators/prey?
- Mathematical formulation: **hypotheses**
 - a population numbers $y(t)$ (prey), $z(t)$ (predator) are functions
 - b populations are large $y, z \gg 1$
 - c difference $y - [y] \in [0, 1)$ is negligible ($[y]$ is the integer part of y)
 - d (a)-(c) imply that y, z are continuous
 - e time scale of population change is much larger than predation time interval
 - f many possible predation encounters
 - g (e)-(f) imply that $y(t), z(t)$ differentiable
 - h prey has positive natural growth rate a , predation decrease probability p
 - i predators have a negative growth rate $-b$, feeding increase probability q



- Hypotheses (a)-(i) lead to a system of first-order differential equations

$$\begin{aligned}\frac{dy}{dt} &= ay - pyz \\ \frac{dz}{dt} &= -bz + qyz\end{aligned}$$

- As in many biological settings, the above system is **nonlinear** and typically does not admit an analytical solution so numerical approaches are required

- Though analytical solutions are either impossible or tedious to obtain, numerical and approximate solutions are possible
- Modern computational, symbolic software systems easily construct solutions
- Lotka-Volterra system formulation in Mathematica

```
In[66] := PreyEq = y'[t] == a y[t] - p y[t] z[t];  
          PredEq = z'[t] == -b y[t] + q y[t] z[t];  
          LVparams = {a->0.7, b->1, p->1.3, q->1};  
          ICs = {y[0]==1,z[0]==0.5};  
          LVsystem = Flatten[{PreyEq,PredEq,ICs} /. LVparams]
```

- Numerical solution

```
In[79] := sol = NDSolve[LVsystem,{y[t],z[t]},{t,0,1.5}][[1]]
```

- Though analytical solutions are either impossible or tedious to obtain, numerical and approximate solutions are possible
- Modern computational, symbolic software systems easily construct solutions
- Lotka-Volterra system formulation in Mathematica

```
In[66] := PreyEq = y'[t] == a y[t] - p y[t] z[t];  
          PredEq = z'[t] == -b y[t] + q y[t] z[t];  
          LVparams = {a->0.7, b->1, p->1.3, q->1};  
          ICs = {y[0]==1, z[0]==0.5};  
          LVsystem = Flatten[{PreyEq, PredEq, ICs} /. LVparams]
```

$$\{y'(t) = 0.7 y(t) - 1.3 y(t) z(t), z'(t) = y(t) z(t) - y(t), y(0) = 1, z(0) = 0.5\}$$

- Numerical solution

```
In[79] := sol = NDSolve[LVsystem, {y[t], z[t]}, {t, 0, 1.5}][[1]]
```

- Though analytical solutions are either impossible or tedious to obtain, numerical and approximate solutions are possible
- Modern computational, symbolic software systems easily construct solutions
- Lotka-Volterra system formulation in Mathematica

```
In[66] := PreyEq = y'[t] == a y[t] - p y[t] z[t];  
          PredEq = z'[t] == -b y[t] + q y[t] z[t];  
          LVparams = {a->0.7, b->1, p->1.3, q->1};  
          ICs = {y[0]==1, z[0]==0.5};  
          LVsystem = Flatten[{PreyEq, PredEq, ICs} /. LVparams]
```

$$\{y'(t) = 0.7 y(t) - 1.3 y(t) z(t), z'(t) = y(t) z(t) - y(t), y(0) = 1, z(0) = 0.5\}$$

- Numerical solution

```
In[79] := sol = NDSolve[LVsystem, {y[t], z[t]}, {t, 0, 1.5}][[1]]
```

$$\{y(t) \rightarrow \text{InterpolatingFunction}[](t), z(t) \rightarrow \text{InterpolatingFunction}[](t)\}$$

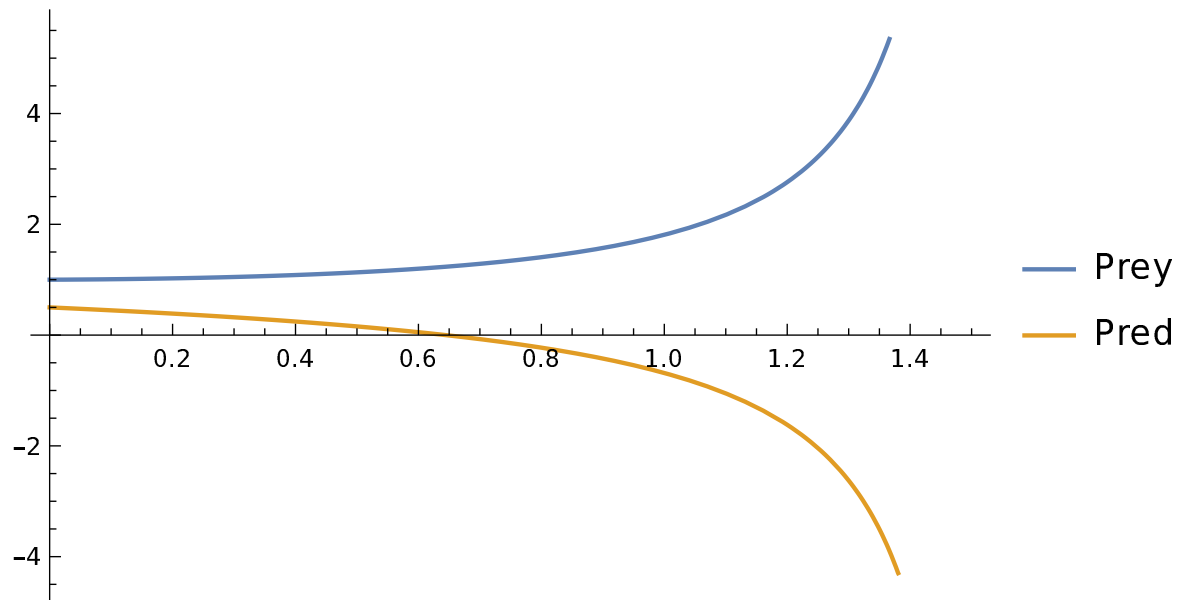
- Graphical presentation

```
In[80] := Plot[Evaluate[{y[t], z[t]} /. sol], {t, 0, 1.5}, PlotLegends -> {"Prey",  
    "Pred"}]
```

```
In[81] :=
```


- Graphical presentation

```
In[80] := Plot[Evaluate[{y[t],z[t]} /. sol], {t,0,1.5},PlotLegends->{"Prey",  
"Pred"}]
```



```
In[81] :=
```

- $\mathbf{x} \in \mathbb{R}^n$ independent, $\mathbf{y} \in \mathbb{R}^m$ dependent variables, $\mathbf{A} \in \mathbb{R}^{m \times n}$ a matrix

$$\mathbf{y}(\mathbf{x}) = \mathbf{A}\mathbf{x} \tag{1}$$

is a linear relationship that satisfies

$$\mathbf{y}(\alpha_1 \mathbf{x}_1 + \alpha_2 \mathbf{x}_2) = \alpha_1 \mathbf{y}(\mathbf{x}_1) + \alpha_2 \mathbf{y}(\mathbf{x}_2)$$

$$\mathbf{A}(\alpha_1 \mathbf{x}_1 + \alpha_2 \mathbf{x}_2) = \alpha_1 \mathbf{A}\mathbf{x}_1 + \alpha_2 \mathbf{A}\mathbf{x}_2$$

for any scalars $\alpha_1, \alpha_2 \in \mathbb{R}$

- For $m = n = 1$, scalar linear relation $y = kx$, e.g., $y = \frac{9}{5}x$, with $y = F - 32$ the Fahrenheit temperature above the melting point of ice at standard atmospheric pressure and $x = C$ the Celsius temperature.

```
In[84] := SetDirectory[$HomeDirectory <> "/courses/MATH564/lessons"];  
p = Plot[ 9c/5+32, {c,0,100},  
        Frame->True,FrameLabel->{"Temp C","Temp F"},  
        GridLines->Automatic];  
Export["CelsiusToFahrenheit.png",p]
```

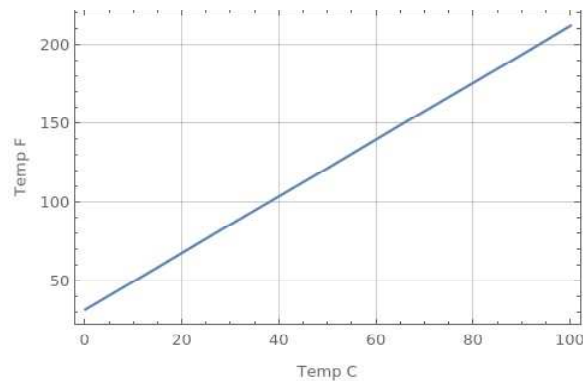


Figure 1. Linear dependence plot

```
In[84] := SetDirectory[$HomeDirectory <> "/courses/MATH564/lessons"];  
p = Plot[ 9c/5+32, {c,0,100},  
         Frame->True,FrameLabel->{"Temp C","Temp F"},  
         GridLines->Automatic];  
Export["CelsiusToFahrenheit.png",p]
```

CelsiusToFahrenheit.png

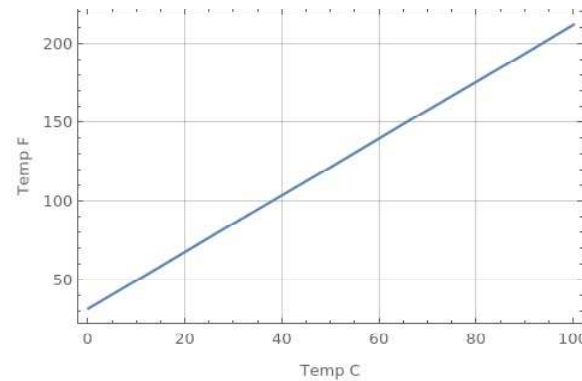


Figure 2. Linear dependence plot

- Transform $y = Ax^k$ into linear dependence of $\log y$ on $\log x$,

$$\log y = k \log x + \log A$$

```
In[87] := y = A x^k
```

```
In[88] := PowerExpand[Log[y]]
```

```
In[89] := {Expand[(a+b)^3], TrigExpand[Cos[a+b]]}
```

```
In[90] :=
```

- Transform $y = Ax^k$ into linear dependence of $\log y$ on $\log x$,

$$\log y = k \log x + \log A$$

```
In[87] := y = A x^k
```

 Ax^k

```
In[88] := PowerExpand[Log[y]]
```

```
In[89] := {Expand[(a+b)^3], TrigExpand[Cos[a+b]]}
```

```
In[90] :=
```

- Transform $y = Ax^k$ into linear dependence of $\log y$ on $\log x$,

$$\log y = k \log x + \log A$$

```
In[87] := y = A x^k
```

$$Ax^k$$

```
In[88] := PowerExpand[Log[y]]
```

$$\log(A) + k \log(x)$$

```
In[89] := {Expand[(a+b)^3], TrigExpand[Cos[a+b]]}
```

```
In[90] :=
```

- Transform $y = Ax^k$ into linear dependence of $\log y$ on $\log x$,

$$\log y = k \log x + \log A$$

```
In[87] := y = A x^k
```

$$Ax^k$$

```
In[88] := PowerExpand[Log[y]]
```

$$\log(A) + k \log(x)$$

```
In[89] := {Expand[(a+b)^3], TrigExpand[Cos[a+b]]}
```

$$\{a^3 + 3a^2b + 3ab^2 + b^3, \cos(a)\cos(b) - \sin(a)\sin(b)\}$$

```
In[90] :=
```