## Applications of Autonomous Computational Methods for Finding Step-by-Step Solutions

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### 23rd Joint UTEP/NMSU Workshop on Mathematics, Computer Science, and Computational Sciences

### Outline



- 2 Automatically Generated Examples
- 3 New Computational Methods



4 Self-Adaptive and Autonomous Computational Methods

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# **Online Learning**

### Online Learning

Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

### **TA Homework**

	Return to my homepage		
Username:	ta		
First Name:	Andrew		
Last Name:	Pownuk		
Group:	2018-Spring-MATH-4329-CRN-24656		
	Logoff		

Number of homework: 12

Create new Homework

homework-description	Homework 13
homework-id	Homework-13
link	homework/Homework-13.aspx
tries-max	10

# **Online Learning**

### Online Learning

- Automatically Generated Examples
- New Computational Methods
- Self-Adaptive and Autonomous Computational Methods

Conclusions

- Sharing the lecture notes.
- Interactive platform for doing online homework.

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- Automated system for checking attendance.
- Integrated response system.
- Grades management system.
- Interactive projects.

## Automatically Generated Examples

#### Online Learning

Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

- It is necessary to explain as basic mathematical/scientific concepts in details.
- Student's can compare their work with available examples.
- Automatically generated examples can be used as sample assignments in on-line homework, exams, and ungraded assignments.
- Automatically generated examples can be related to many different methods for solutions.
- It is possible to crated millions examples in a very short time.
- If all inference rules are done properly, then the examples are without errors.

# Example (differentiation)

#### Online Learning

### Automatically Generated Examples

- New Computational Methods
- Self-Adaptive and Autonomous Computational Methods
- Conclusions

- Table of basic formulas for differentiation.
- Product rule, quotient rule, chain, rule etc..
- Rules for simpling expression.
- Automatically generated examples can be related to many different methods for solutions.
- Knowledge available to the system is in the format which is almost exactly **the same like in the regular textbooks** (no machine learning ...).

## Example (differentiation)

Sample formulas

#### Online Learning

### Automatically Generated Examples

New Computational Methods

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$$cos (x) + cos (x) + 2 + sin (sin (x))$$
(4591)  

$$cos (x) + cos (x) + 2 + sin (cos (x))$$
(4592)  

$$cos (x) + cos (x) + 2 + cos (2)$$
(4593)  

$$cos (x) + cos (x) + 2 + cos (x)$$
(4594)  

$$cos (x) + cos (x) + 2 + cos (sin (x))$$
(4595)  

$$cos (x) + cos (x) + 2 + cos (cos (x))$$
(4596)

### Example

#### Online Learning

### Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

### Sample results

$$\begin{array}{ll} \cos{(x)} + -1 \cdot \sin{(x)} + -1 \cdot \sin{(\sin{(x)})}) \cdot \cos{(\sin{(x)})} \cdot \cos{(x)} & (3794) \\ \cos{(x)} + -1 \cdot \sin{(x)} + -1 \cdot \sin{(\sin{(\cos{(x))})}} \cdot \cos{(\cos{(x)})} \cdot -1 \cdot \sin{(x)} & (3795) \\ \cos{(x)} + -1 \cdot \sin{(x)} + -1 \cdot \sin{(\cos{(2))}} \cdot -1 \cdot \sin{(2)} \cdot 0 & (3796) \\ \cos{(x)} + -1 \cdot \sin{(x)} + -1 \cdot \sin{(\cos{(x))}} \cdot -1 \cdot \sin{(x)} & (3797) \\ \cos{(x)} + -1 \cdot \sin{(x)} + -1 \cdot \sin{(\cos{(\sin{(x))})}} \cdot -1 \cdot \sin{(x)} ) \cdot \cos{(x)} & (3798) \\ \cos{(x)} + -1 \cdot \sin{(x)} + -1 \cdot \sin{(\cos{(\cos{(x))})}} \cdot -1 \cdot \sin{(\cos{(x))}} \cdot -1 \cdot \sin{(x)} & (3799) \\ \end{array}$$

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# Example (Latex source)

Online Learning	
Automatically Generated Examples	
New	
Computational	4335 $\equation \cos\equation +x+2+\sin\equation \cos\equation \cos\equation\cos\equation \cos\equation \cos\equation\cos\equation \cos\equation \cos\equation \cos\equat$
Methods	<pre>4336 \begin{equation}\cos\left(x\right)+x+2+\sin\left(x\right)\end{equation}</pre>
	4337 \begin{equation}\cos\left(x\right)+x+2+\sin\left(\sin\left(x\right)\right)\end{equation}
Self-Adaptive	4338 \begin{equation}\cos\left(x\right)+x+2+\sin\left(\cos\left(x\right)\right)\end{equation}
and	4339 \begin{equation}\cos\left(x\right)+x+2+\cos\left(2\right)\end{equation}
Autonomous	4340 \begin{equation}\cos\left(x\right)+x+2+\cos\left(x\right)\end{equation}
Communication	4341 \begin{equation} \cos\left(x\right)+x+2+\cos\left(\sin\left(x\right)\right) \end[equation]
Computational	4342 \begin{equation} \cos\left(x\right)+x+2+\cos\left(\cos\left(x\right)\right)\end{equation}
Methods	4343 \begin{equation} \cos\left(x\right)+x+2+2+2 \end(equation)
	4344 \begin{equation} \cos\left(x\right)+x+2+2+x\end(equation)
Conclusions	4345 \begin{equation} \cos\lert(X\right)+x+2z+\sin\lert(X\right) \end(equation) 4345 \begin{equation}
	4346 (begin (equation) (cos) left (u) right) +x2727 (cos) left (x (right) (end(equation))
	434/ begin(equation)(cos)(etc)(x)(ight)(x+2x+x)(end(equation))
	4340 begin (equation) cos left (x) right) +x2+x+ cos left (x) right) cond(equation)
	$4350$ \begin fequation \cos \left (x\right) + x+2+ \sin \left (x\right) + \sin \left (x\right) + sin \left (
	$4351 \ begin (equation) \cos left (x)right) + x+2+ \sin left (x)right) + \cos left (x)right) + cond(equation)$
	4352 (begin (equation)) $\cos(1 + (x) $
	4353 \begin{equation} cos\left(x\right) +x+x+x\end(equation)

# Step by Step Solution

Online Learning

#### Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

### Wolpharm Alpha

Indefinite integrals:

 $\int x \exp(x) \, dx = e^x \, (x-1) + \text{constant}$ 

Possible intermediate steps: Take the integral:

 $\int e^x x dx$ 

For the integrand  $e^x x$ , integrate by parts,  $\int f dg = f g - \int g df$ , where f = x,  $dg = e^x dx$ , df = dx,  $g = e^x$ :  $= e^x x - \int e^x dx$ 

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The integral of  $e^x$  is  $e^x$ : =  $e^x x - e^x$  + constant

# Differentiation (step 1)

#### Online Learning

### Automatically Generated Examples

- New Computational Methods
- Self-Adaptive and Autonomous Computational Methods
- Conclusions

$\cos\left(x\right) + \left(\cos\left(x\right) + \cos\left(2\right)\right)$	(765)
$\cos\left(x\right) + \left(\cos\left(x\right) + \cos\left(x\right)\right)$	(766)
$\cos\left(x\right) + \left(\cos\left(x\right) + \cos\left(\sin\left(x\right)\right)\right)$	(767)
$\cos\left(x\right) + \left(\cos\left(x\right) + \cos\left(\cos\left(x\right)\right)\right)$	(768)
$\cos(x) + (\cos(x) + (2+2))$	(769)
$\cos(x) + (\cos(x) + (2 + x))$	(770)
$\cos(x) + (\cos(x) + (2 + \sin(x)))$	(771)
$\cos(x) + (\cos(x) + (2 + \cos(x)))$	(772)
$\cos\left(x\right) + \left(\cos\left(x\right) + \left(x + x\right)\right)$	(773)

# Differentiation (step 2)

#### Online Learning

### Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computationa

$$\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\left(\cos\left(x\right) + \cos\left(2\right)\right) \tag{765}$$

$$\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\left(\cos\left(x\right) + \cos\left(x\right)\right) \tag{766}$$

$$\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\left(\cos\left(x\right) + \cos\left(\sin\left(x\right)\right)\right) \tag{767}$$

$$\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\left(\cos\left(x\right) + \cos\left(\cos\left(x\right)\right)\right) \tag{768}$$

$$\frac{d}{dx}\cos(x) + \frac{d}{dx}(\cos(x) + (2+2))$$
(769)

$$\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\left(\cos\left(x\right) + (2+x)\right) \tag{770}$$

$$\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\left(\cos\left(x\right) + \left(2 + \sin\left(x\right)\right)\right) \tag{771}$$

# Differentiation (step 3)

#### Online Learning

### Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

$$(-1) \cdot \sin\left(x\right) + \left(\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\sin\left(x\right)\right) \tag{762}$$

$$(-1) \cdot \sin\left(x\right) + \left(\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\sin\left(\sin\left(x\right)\right)\right)$$
(763)

$$(-1) \cdot \sin\left(x\right) + \left(\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\sin\left(\cos\left(x\right)\right)\right)$$
(764)

$$(-1) \cdot \sin\left(x\right) + \left(\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\cos\left(2\right)\right) \tag{765}$$

$$(-1) \cdot \sin\left(x\right) + \left(\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\cos\left(x\right)\right) \tag{766}$$

$$(-1) \cdot \sin\left(x\right) + \left(\frac{d}{dx}\cos\left(x\right) + \frac{d}{dx}\cos\left(\sin\left(x\right)\right)\right)$$
(767)

# Differentiation (step 4)

#### Online Learning

### Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{du}\cos\left(u\right)\right)_{u=\sin\left(x\right)}\cdot\frac{d}{dx}\sin\left(x\right)\right)$$
(767)

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{du}\cos\left(u\right)\right)_{u=\cos\left(x\right)}\cdot\frac{d}{dx}\cos\left(x\right)\right)$$
(768)

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{dx}2 + \frac{d}{dx}2\right)\right)$$
(769)

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{dx}2 + \frac{d}{dx}x\right)\right)$$
(770)

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{dx}2 + \frac{d}{dx}\sin\left(x\right)\right)\right)$$
(771)

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{dx}2 + \frac{d}{dx}\cos\left(x\right)\right)\right)$$
(772)

$$(-1)\cdot\sin\left(x\right) + \left((-1)\cdot\sin\left(x\right) + \left(\frac{d}{dx}x + \frac{d}{dx}x\right)\right)$$
(773)

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# Differentiation (step 5)

#### Online Learning

### Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + \cos(\sin(x)) \cdot \cos(x))$$
(763)

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + \cos(\cos(x)) \cdot (-1) \cdot \sin(x))$$
(764)

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + 0 \cdot 0) \tag{765}$$

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (-1) \cdot \sin(x))$$
(766)

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (-1) \cdot \sin(\sin(x)) \cdot \cos(x))$$
(767)

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (-1) \cdot \sin(\cos(x)) \cdot (-1) \cdot \sin(x))$$
(768)

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (0+0)) \tag{769}$$

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (0+1)) \tag{770}$$

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (0 + \cos(x))) \tag{771}$$

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (0 + (-1) \cdot \sin(x)))$$
(772)

$$(-1) \cdot \sin(x) + ((-1) \cdot \sin(x) + (1+1)) \tag{773}$$

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## New Computational Methods

Online Learning

Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

Available information.

• Linear equation with one variable.

$$2 + x = 4$$

Solution

*x* = 2

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• Knowledge base of mathematical operations, theorems, etc.

### Solution

#### Online Learning

Automatically Generated Examples

### New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

Solution procedure computed automatically based on available knowledge.

• 2 + x = 4

Now it is possible to create new solution procedure based on presented algorithm and use it for solution of other problems, etc.

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### Integration

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### New Computational Methods

Self-Adaptive and Autonomous Computational Methods

Conclusions

### Problem

- $\int (2x+1)dx$
- Rules for integration, theorems, algebraic rules, etc.

### Solution

- $\int (2x+1)dx$
- $\int 2xdx + \int 1dx$
- $2 \int x dx + x$ •  $2 \frac{x^2}{2} + x + C$

Now it is possible to implement this method as a new procedure and use it in the future.

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# Self-Adaptivity

Online Learning

Automatically Generated Examples

New Computational Methods

Self-Adaptive and Autonomous Computational Methods

- The system is fully autonomous. All changes in the program can be done automatically without interaction with the user.
- All changes of the code of the program can be done during the runtime.
- System is distributed and can work independently on many computers which improve reliability of the system.
- Once information is added to the system it will never be forgotten and can be reused in the future in order to create new (improved) knowledge.
- Presented methodology can be applied not only to mathematical problems but also to any other scientific field which can be described by some abstract concepts (e.g. statistics, engineering, chemistry, biology, computer science etc.).

## Imaginary Universe of Scientific Knowledge

Online Learning

Automatically Generated Examples

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Self-Adaptive and Autonomous Computational Methods

Conclusions

"Imaginary Universe" terms used by some MIT researchers. Quantum Artificial Life in an IBM Quantum Computer (U. Alvarez-Rodriguez, M. Sanz, L. Lamata & E. Solano). Scientific Reports volume 8, Article number: 14793 (2018)

- Mathematical/scientific knowledge can be treated as independent units that can interact with each-other and create new, possibly useful knowledge.
- Generation of new knowledge can be fully automated and autonomous. No interaction with humans is necessary.
- Development of new knowledge is possible in many different fields (e.g. statistics, engineering, chemistry, biology, computer science etc.).

### Conclusions

#### Online Learning

Automatically Generated Examples

- New Computational Methods
- Self-Adaptive and Autonomous Computational Methods
- Conclusions

- By using presented methodology it is possible to create complex educational examples in many areas of mathematics as well as in other areas of science and engineering.
- In a few minutes it is possible to create thousands pages with typical examples without interaction with humans and that can be used in education.
- By using self adaptive computational methods it is possible to automatically generate new mathematical theorems completely independently from human interactions.