

hello deep Learning
d d d d d d d d d d d d d d d

Welcome
d d d d d e d

a b c d e f g h i j k l m n o p q r s t u
d d d d d d e d d d d d d d d d d e d d d d

v w x y z
d d d d d

Deep learning totally from scratch

There is hope



Who am I, who are
you

An encouraging message from ChatGPT

Dear software developer friends,

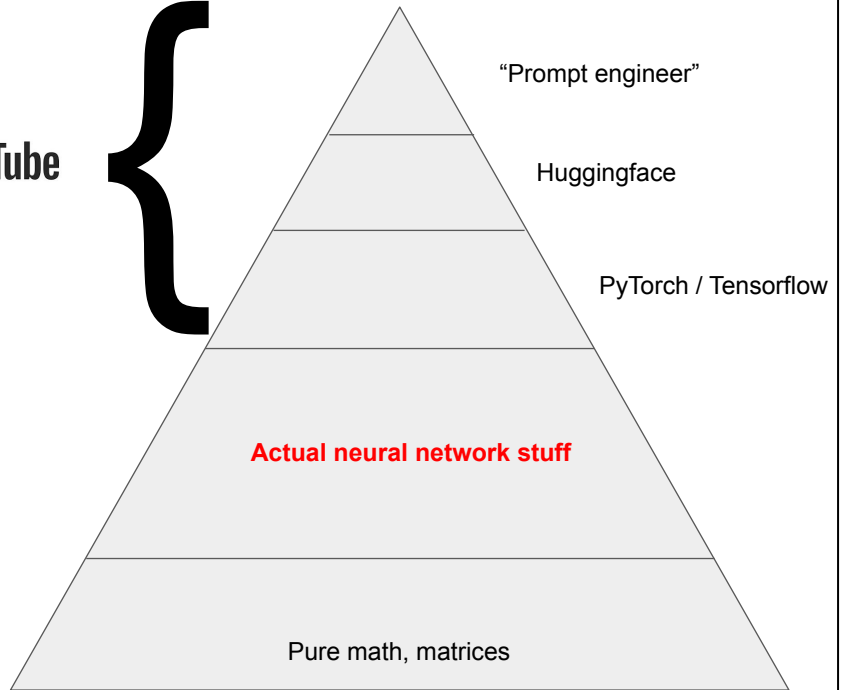
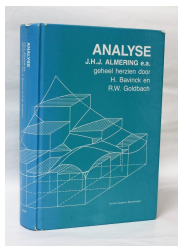
I want to assure you that your future as computer programmers is **secure and promising**. While technologies like ChatGPT are impressive, they are tools created by developers like yourselves. Embrace AI as a valuable addition to your toolkit, enabling you to automate tasks and focus on higher-level challenges.

The demand for skilled software developers continues to grow rapidly. New opportunities arise as technology advances, requiring your expertise to develop and maintain cutting-edge systems. **Your problem-solving skills, creativity, and ability to understand users will always be in demand.**

Remember, technology is a tool that complements and amplifies human capabilities. Embrace the changing landscape, continue to enhance your skills, and explore new horizons. Trust in your abilities, stay positive, and **keep learning**. The world needs your expertise now more than ever.

Warm regards,
ChatGPT

Here goes..



<https://berthub.eu/>



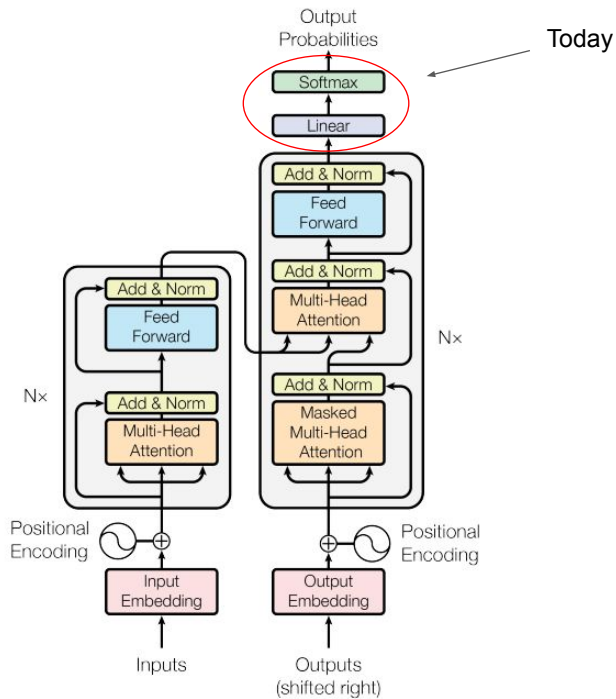
Hello Deep Learning Project

- Totally from scratch (except a matrix library, plus some image parsing)
 - 1500 line handwritten OCR solution!
 - No GPU
- 10 chapter series of blog posts
- Code on GitHub
- This presentation is mostly a teaser for Hello Deep Learning!
- <https://berthub.eu/articles/posts/hello-deep-learning/>



“Attention Is All You Need”

<https://arxiv.org/abs/1706.03762>



NIST

**National Institute of
Standards and Technology**

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Convolutional Network Demo from 1989



VIDEOS

https://www.youtube.com/watch?v=FwFduRA_L6Q&t=1s

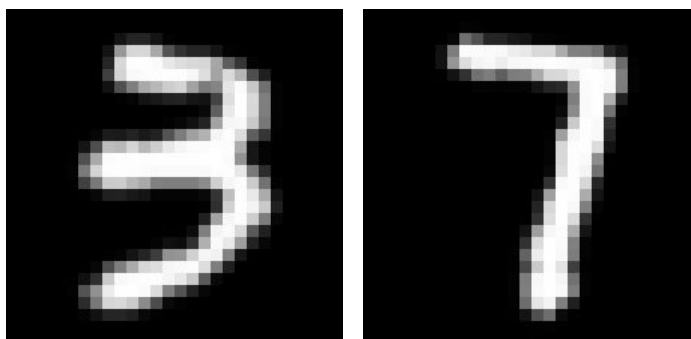
https://www.youtube.com/watch?v=FwFduRA_L6Q&t=1s

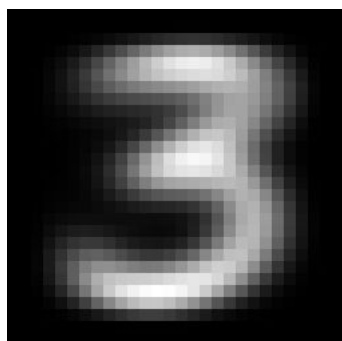
EMNIST: an extension of MNIST to handwritten letters

Gregory Cohen, Saeed Afshar, Jonathan Tapson, and André van Schaik

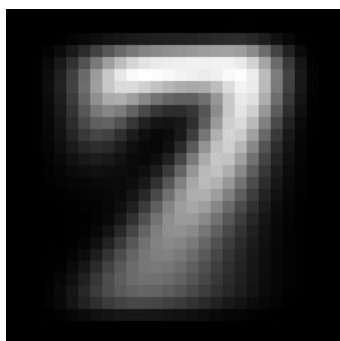
	Type	No. Classes	Training	Testing	Total
By Class	Digits	10	344,307	58,646	402,953
	Uppercase	26	208,363	11,941	220,304
	Lowercase	26	178,998	12,000	190,998
	Total	62	731,668	82,587	814,255
By Merge	Digits	10	344,307	58,646	402,953
	Letters	37	387,361	23,941	411,302
	Total	47	731,668	82,587	814,255
MNIST [1]	Digits	10	60,000	10,000	70,000

<https://arxiv.org/pdf/1702.05373v1.pdf>

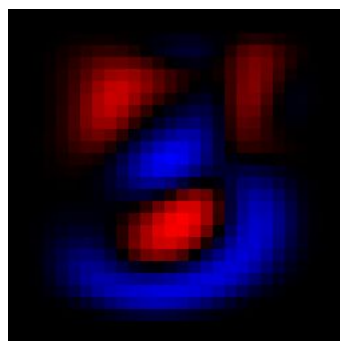


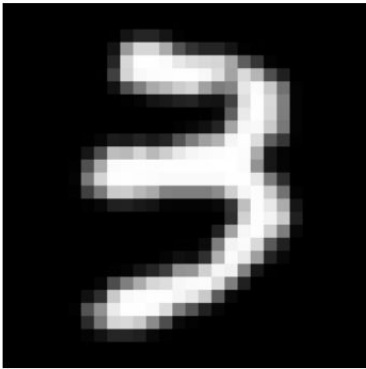


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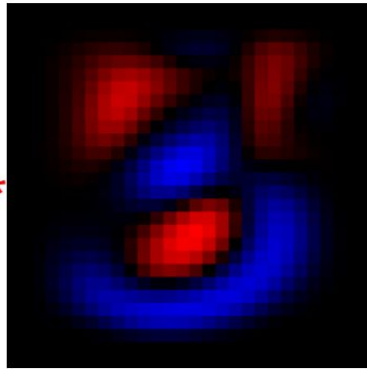


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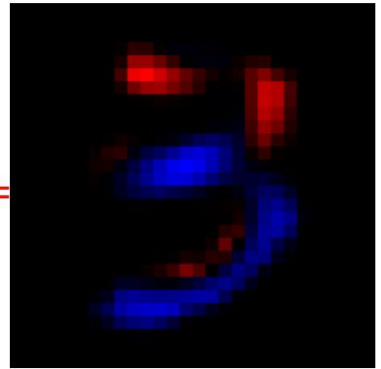




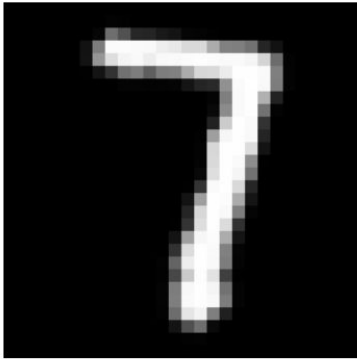
*



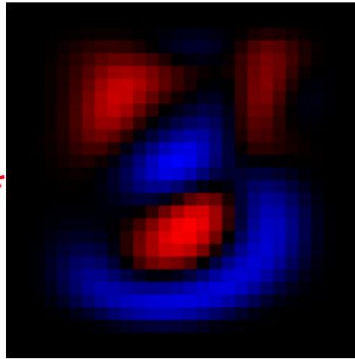
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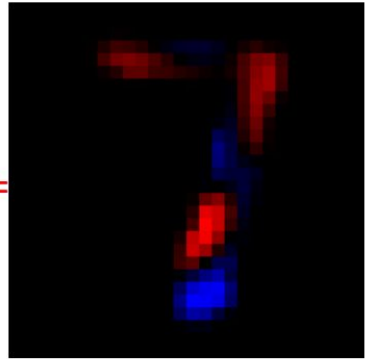
“More blue → it is a 3”



*

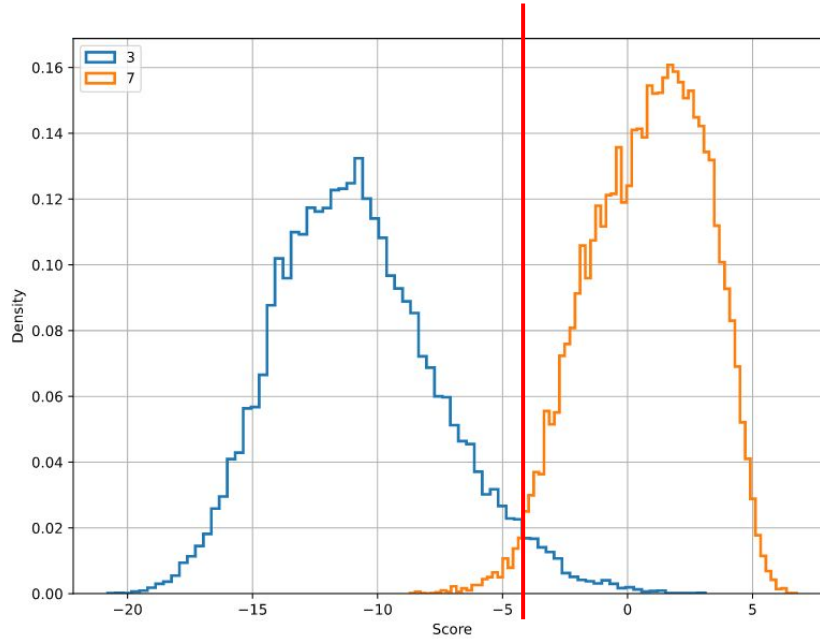


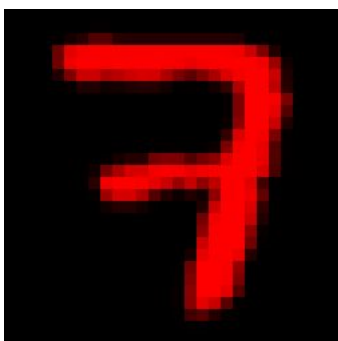
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"More red → it is a 7"

97.025% correct: **unreasonably effective**





Weirdly impressive.
Now for some actual
learning.

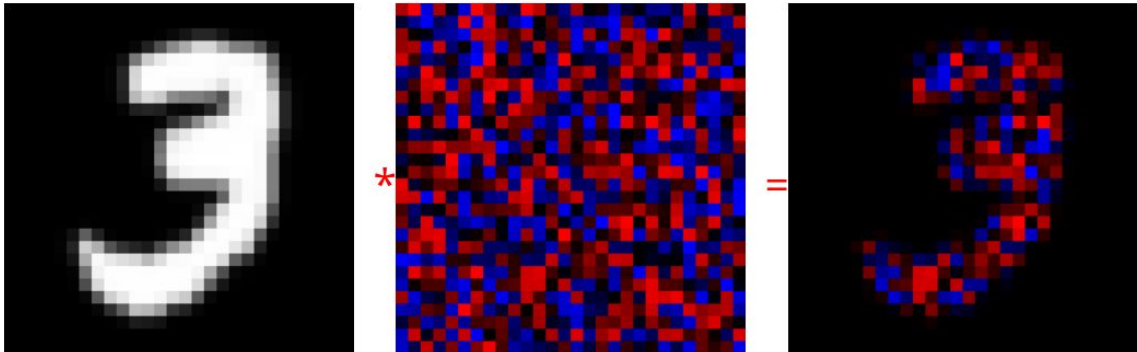
$$R = \sum image \circ w + b$$

$$R = image \cdot w + b$$

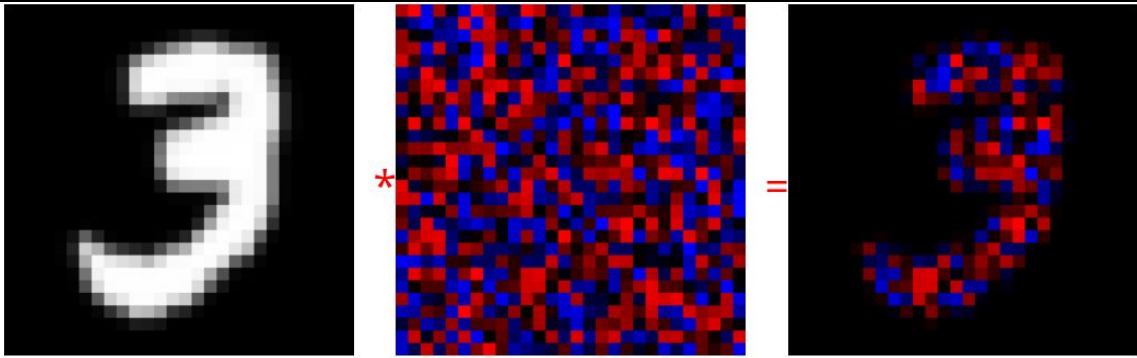
$R > 0 \rightarrow$ It is a 7

$$R = image \cdot w + b$$

w



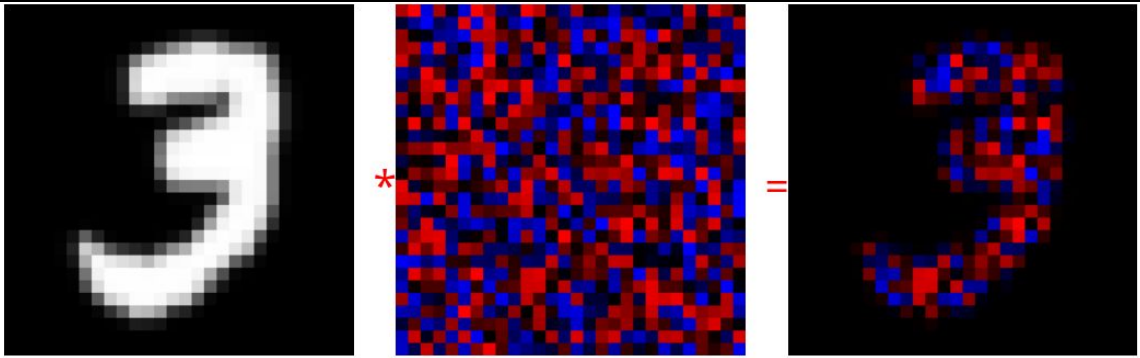
$$R = p_1 w_1 + p_2 w_2 + \dots + p_{783} w_{783} + p_{784} w_{784}$$



$$R = p_1 w_1 + p_2 w_2 + \dots + p_{783} w_{783} + p_{784} w_{784}$$

How do we make R go down? How about the simplest way possible:

$$w_{1\text{new}} = -\frac{dR}{dw_1} * Lr + w_1$$

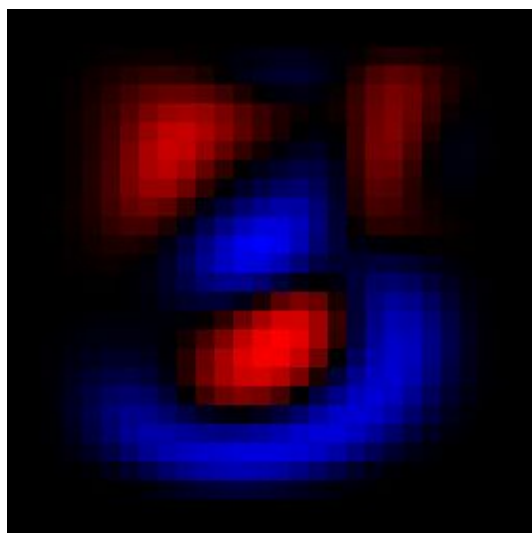
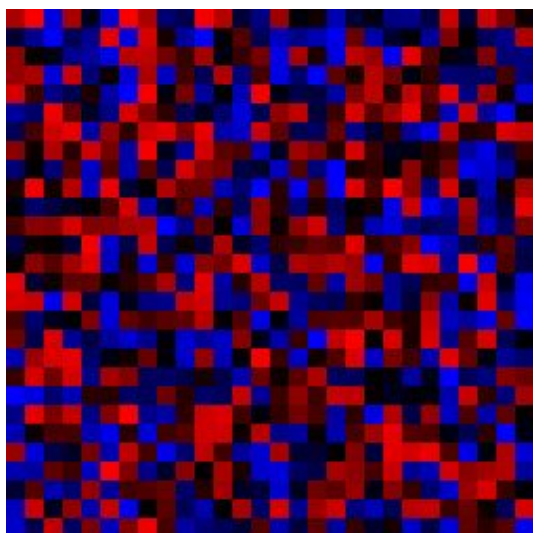


$$R = p_1 w_1 + p_2 w_2 + \dots + p_{783} w_{783} + p_{784} w_{784}$$

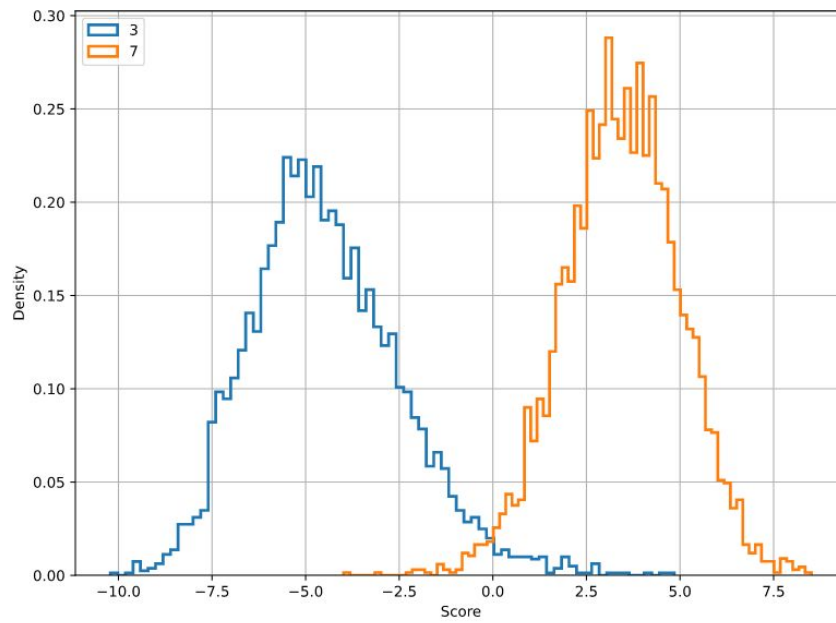
How do we make R go down? How about the simplest way possible:

$$w_{1\text{new}} = -p_1 * Lr + w_1$$

That can't possibly
work



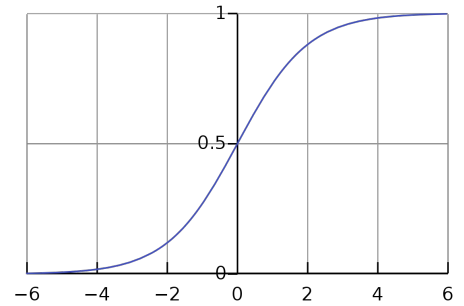
>98% correct...



This really is the
magic. Somehow it
works.

The “loss function”

- Our “decision rule” so far was: $R > 0 \rightarrow 7$, $R < 0 \rightarrow 3$
- Modern neural networks use a ‘loss function’, which you then attempt to minimize
- The loss function is the difference between the desired output and the actual output
- For a “is it a 3 or a 7 problems”, the output of the calculation is often fed through a sigmoid function
- 0 then represents “3” and 1 represents “7”



088807537891067161709199776286235
025975427932919228347342389084898
121254181226697644356184528166876
973748448358188605915639069584193
340479830792497481775484183537372
482331614007882350557887702864401
815486328693695268676228371438255
769399648046231807572198222916421
146406605055882228842781323074931
783172257122384475218182910453139
926583651583686152454170176577146
421512417882526293434639632644408
730951780157449121362450300974162
535398981015467566626008221167382
217683420096237221122018276110208
327270794614575252132008783541589
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126333710977591306464584564362915
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831787752240049581960868364553600
402234569011587470814308825978828
798755896961455406666216457257749
876672284671556745550839710487293
773566650501090037156182266923466
490693276329601155319305894333001

8	4	4	7	5	2	1	8	1	8	2	9	1
8	6	1	5	2	4	5	4	1	7	0	1	7
2	6	2	9	3	4	3	4	6	3	9	6	3
4	9	1	2	1	3	6	2	4	5	0	3	0
6	7	5	6	6	6	2	6	0	0	8	2	2
3	7	2	2	1	1	2	2	0	1	8	2	7
7	5	2	5	2	1	3	2	0	0	8	7	8
8	6	9	7	8	0	1	2	9	3	8	9	5

Flatten

1			28
28			28



1							784
---	--	--	--	--	--	--	-----

First layer

w

1			128
784			

x

Flattened image

1							784
---	--	--	--	--	--	--	-----

=

1			128
---	--	--	-----

Second layer

w

1						64
128						

x

Output of previous layer

1			128
---	--	--	-----

=

1						64
---	--	--	--	--	--	----

Third layer

w

1			10
64			

Output of previous layer

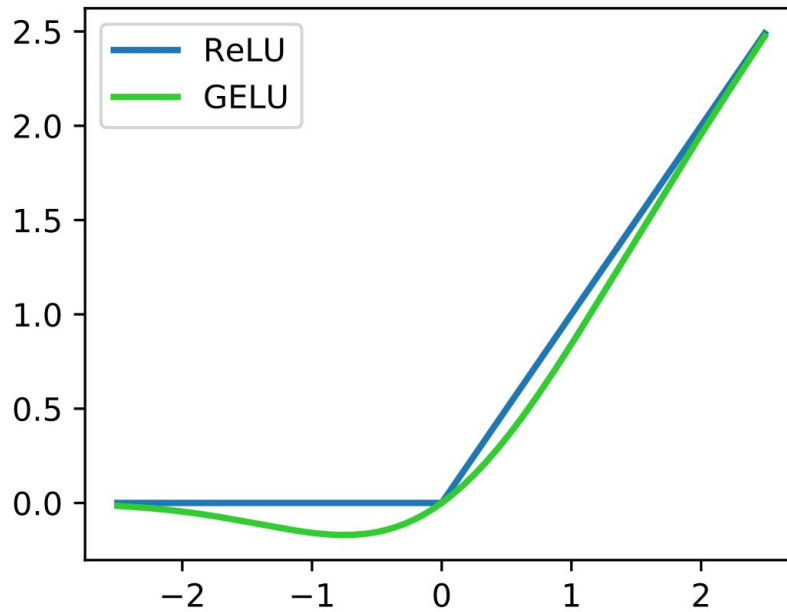
1						64
---	--	--	--	--	--	----

x

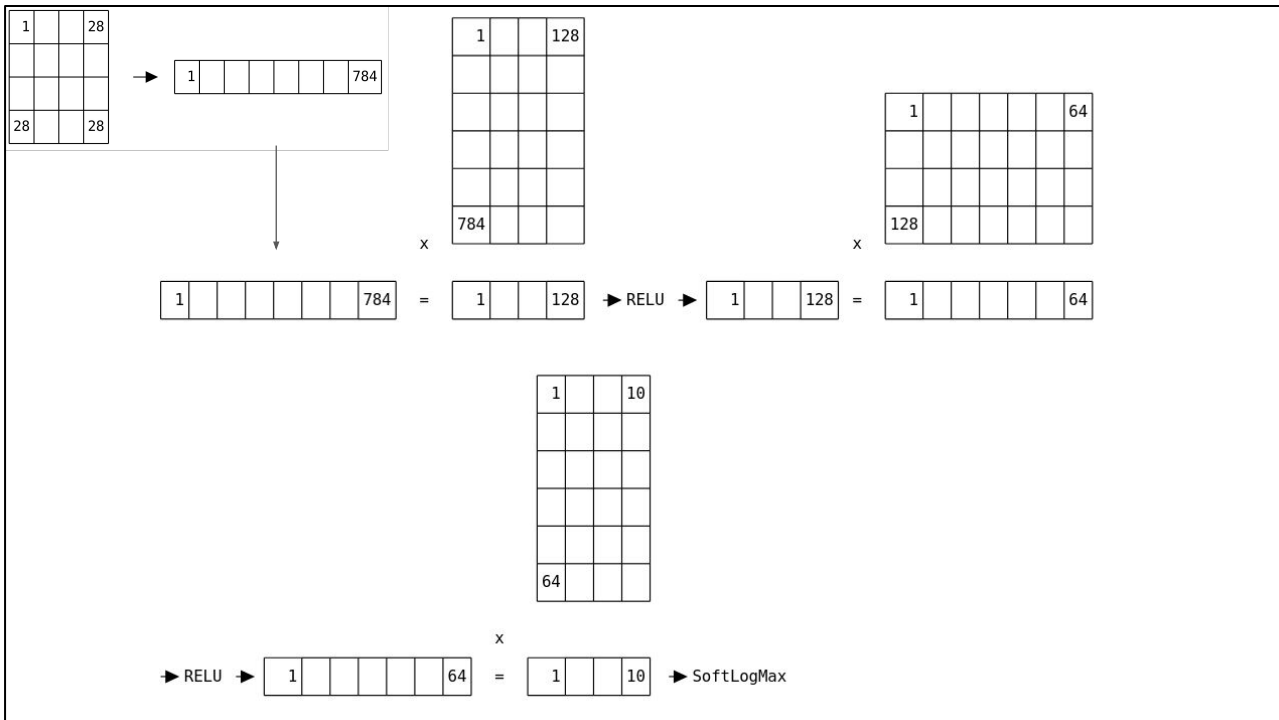
=

1			10
---	--	--	----

Nonlinearities



https://en.wikipedia.org/wiki/Rectifier_%28neural_networks%29#/media/File:ReLU_and_GELU.svg



$$\text{LogSoftmax}(x_i) = \log \left(\frac{\exp(x_i)}{\sum_j \exp(x_j)} \right) = x_i - \log \left(\sum_j \exp(x_j) \right)$$

#	0	1	2	3	4	5	6	7	8	9
---	---	---	---	---	---	---	---	---	---	---

In:	[-2.5,	-4,	-3,	-0.5,	-4.4,	4,	-0.75,	-0.25,	-0.5,	-2.0]
-----	--------	-----	-----	-------	-------	----	--------	--------	-------	-------

Out:	[-6.5,	-8.04,	-7.05,	-4.55,	-8.459,	-0.05,	-4.80,	-4.30,	-4.55,	-6.05]
------	--------	--------	--------	--------	---------	--------	--------	--------	--------	--------



exp(-0.05) chance = nearly 100%


```
void init(State& s)
{
    auto output = s.lc1.forward(makeFlatten({img}));
    auto output2 = makeFunction<ReluFunc>(output);
    auto output3 = s.lc2.forward(output2);
    auto output4 = makeFunction<ReluFunc>(output3);
    auto output5 = s.lc3.forward(output4);
    scores = makeLogSoftMax(output5);
    loss = -(expected*scores);
}
};
```

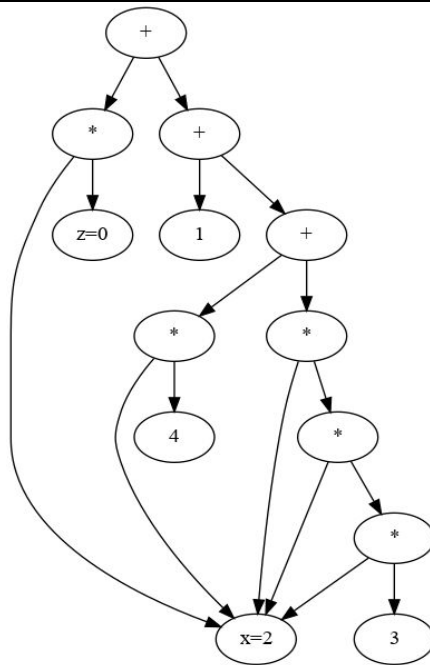
This was the simple formula with no non-linearities & only 784 parameters.

Very easy to differentiate.

$$R = p_1 w_1 + p_2 w_2 + \cdots + p_{783} w_{783} + p_{784} w_{784}$$

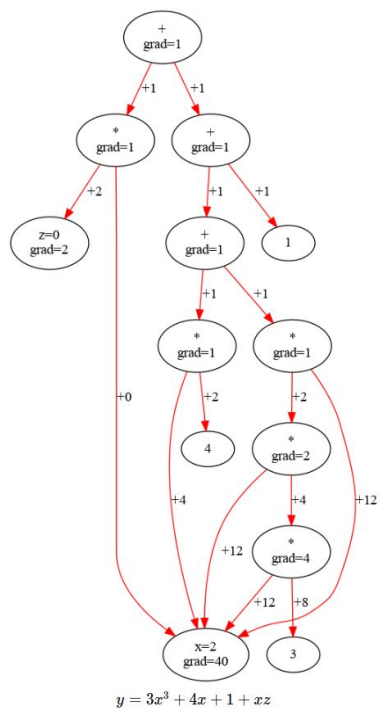
$$w_{1\text{new}} = - \frac{dR}{dw_1} * Lr + w_1$$

“This model involves three matrices of parameters, with in total $128 \times 784 + 64 \times 128 + 10 \times 64 =$ **109184** weights and non-linear functions. There are also $128 + 64 + 10 = 202$ bias parameters.”

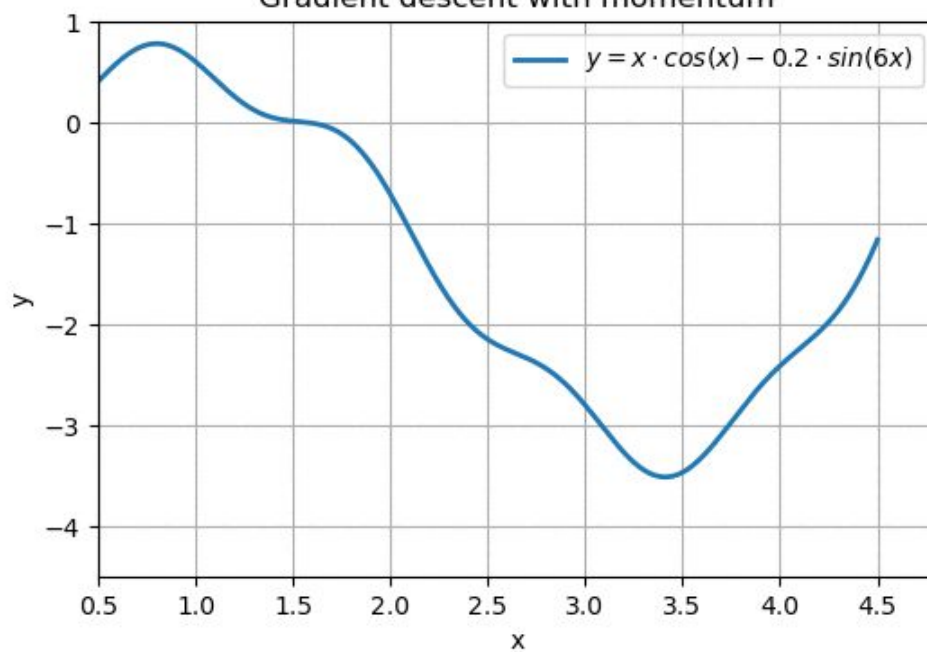


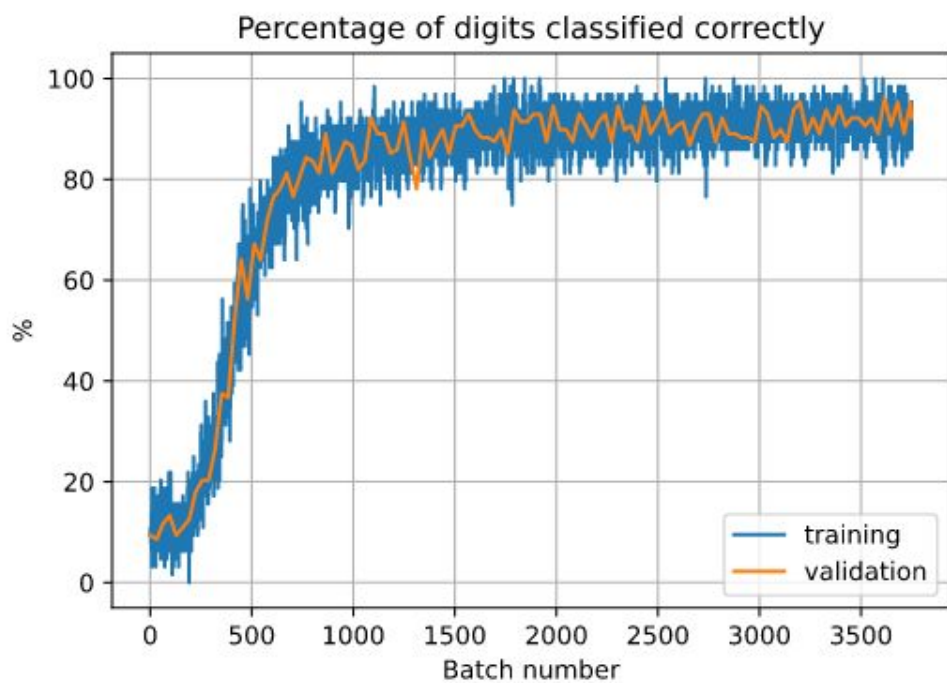
$$y = 3x^3 + 4x + 1 + xz$$

“Auto-gradient”

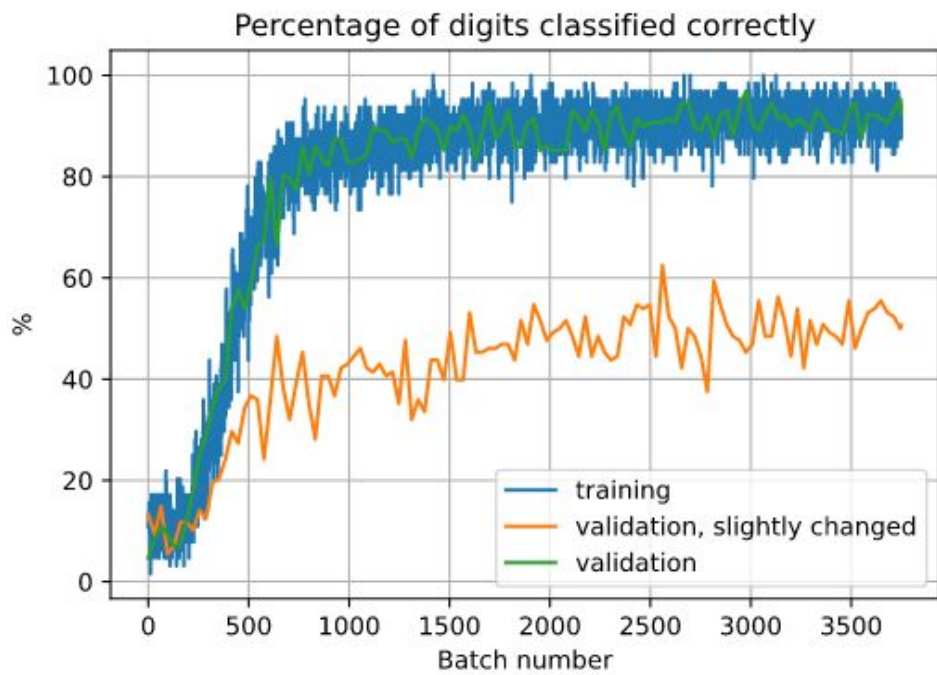


Gradient descent with momentum





	0	1	2	3	4	5	6	7	8	9
0	3750	3	27	25	12	42	16	5	10	10
1	4	3793	25	5	13	24	18	16	87	12
2	32	9	3665	74	22	40	24	12	44	3
3	7	31	32	3581	0	110	0	10	53	34
4	70	34	68	3	3766	86	32	17	63	123
5	48	32	22	143	3	3548	23	3	120	15
6	38	18	79	7	52	48	3865	0	8	0
7	3	3	26	40	2	12	0	3716	11	171
8	46	73	55	83	21	75	22	22	3556	37
9	2	4	1	39	109	15	0	199	48	3595



The rules

If you take away one thing from this series of posts, please let it be that production use of a neural network tends to go through these four phases (if you are lucky):

1. It works on the training data
2. It also works on the validation data
3. After a lot of disappointment, we get it to work on other people's real life data too
4. Other people can get it to work on their own data as well

Almost all demos declare victory after phase 2.

Parting thoughts

- Deep learning is real
- Deep learning achieves magical things
- Deep learning however is not magic & deceptively simple
- You can still get on board!
- **What I'm hoping for: bring deep learning to our own technology!**. Scripts that help us (say) fight spam and abuse in a way we are used to:
 - Modular ON SITE solutions
 - Reliable, robust
 - With metrics & logging & insight -> TO US
- "SQLite for deep learning"
- Please help!

Useful links

- Whisper.cpp: state of the art voice transcription in dozens of languages, entirely self-contained on your own computer/phone:
<https://github.com/ggerganov/whisper.cpp>
- LLaMA “GPT-like”, self-contained, own computer etc:
<https://github.com/ggerganov/llama.cpp>
- <https://berthub.eu/articles/posts/hello-deep-learning/> - the series behind this presentation, <https://github.com/berthubert/hello-dl>
- <https://berthub.eu/articles/posts/ai-is-guaranteed-to-disrupt-us/>

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There is hope

