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# Chinese character recognition

Jeremy Reizenstein

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# Handwriting

# Online handwriting



# Chinese - the Casia online dataset

苞胞包褒剥薄雹堡堡饱宝抱报暴豹鲍爆杯  
碑悲卑北辈背贝钹倍狈备惫焙被奔苯本笨  
崩绷甬泵蹦迸逼鼻比部笔彼碧蓖蔽毕毙蔽  
币庇痹闭敝弊必辟壁臂避陛鞭边编贬扁便  
逮卞辨辨辨遍钵彪膘表瞥瞥别瘡彬斌濒滨  
寔揆乐冰柄丙秉饼炳瞭病并破菠播播钵液  
博勃搏铂箔伯帛舶膊膊渤泊驳捕卜哺补埤  
不布步簿部悌擦猜裁材才财睬睬采彩菜菜

<http://www.nlpr.ia.ac.cn/databases/handwriting/Home.html>

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# Signatures

# Typical approaches



# Signatures

The signature of a path is a set of iterated integrals.

Consider a path in  $\mathbb{R}^3$  parameterised by the variable  $t$  ranging from 0 to 1, given by

$$t \mapsto (f_1(t), f_2(t), f_3(t))$$

Then, for example, the element 2,3 of the signature is

$$\int_0^1 \left[ \int_0^t f'_2(s) ds \right] f'_3(t) dt = \int_0^1 \int_0^t df_2(s) df_3(t)$$

and element 2,1,2 of the signature is

$$\int_0^1 \int_0^t \int_0^s df_2(r) df_1(s) df_2(t).$$



# Signatures

The  $m$ th level of the signature of a path in  $\mathbb{R}^d$  is the  $d^m$  values of the elements with  $m$  integrated integrals. It takes values in  $(\mathbb{R}^d)^{\otimes m}$ . Given a piecewise linear path, it is easy to compute the first  $m$  levels of its signature using a theorem called Chen's identity.

## Log-Signature demonstration

There is redundancy in the signature. The log signature is a transformation of the same information as the signature which is not redundant. For example, in  $\mathbb{R}^2$ , the first four levels of the signature look like this

$$(\cdot) + \left( \begin{pmatrix} (\cdot) \\ (\cdot) \end{pmatrix} \right) + \left( \begin{pmatrix} \begin{pmatrix} (\cdot) \\ (\cdot) \end{pmatrix} \end{pmatrix} \begin{pmatrix} (\cdot) \\ (\cdot) \end{pmatrix} \right) + \left( \begin{pmatrix} \begin{pmatrix} \begin{pmatrix} (\cdot) \\ (\cdot) \end{pmatrix} \end{pmatrix} \begin{pmatrix} (\cdot) \\ (\cdot) \end{pmatrix} \end{pmatrix} \right)$$

- that is  $2 + 4 + 8 + 16 = 30$  numbers while the log signature is only  $2 + 1 + 2 + 3 = 8$  numbers.

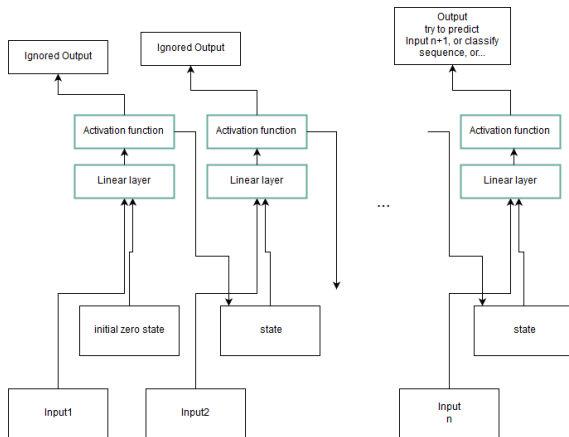
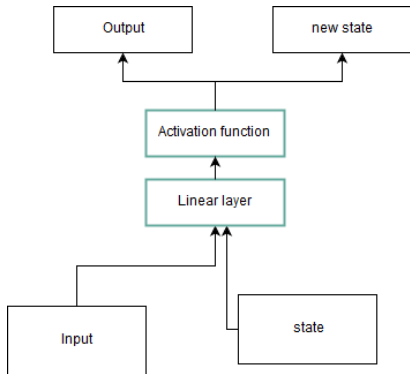
## Questions

A signature is a nice representation of a path of arbitrary length. When is it good enough? What properties of a complicated path can be derived from some levels of its signature? How to balance a representation using more levels of the signature versus chopping the path up and looking at signatures of the chunks?

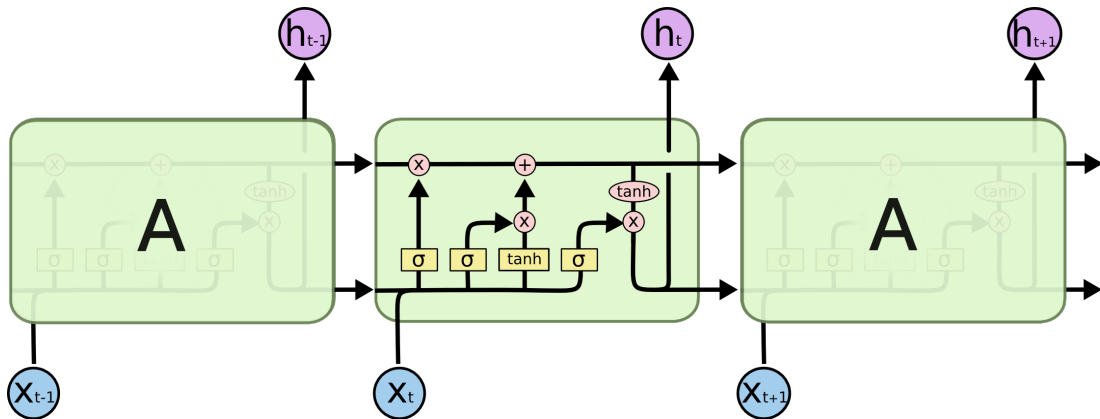
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# Recurrent Neural Networks

# Recurrent Neural Networks



# Long short term memory



# Thanks!

**EPSRC**

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Dr Ben Graham

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