

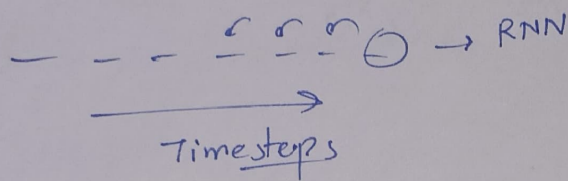
problem with RNN :

[RNNs] → sequential data → Temporal, time Series

↓
suffer ② major problems → [LSTMs] why??

- ① → problem of long term dependencies } → unstable gradients.
② → unstable gradients / stagnated Training - }

ex!



① Applications

→ next word predicts -

→ (Marathi) is spoken in (Mahara)

↓
short distance -

→ (Marathas) a beautiful place I went there last year but I could not enjoy proper. ^{because} I don't understand (marathi)

↓
long term } → it arises due to

[Vanishing gradient problem]

② stagnated Training / unstable Gradient :-

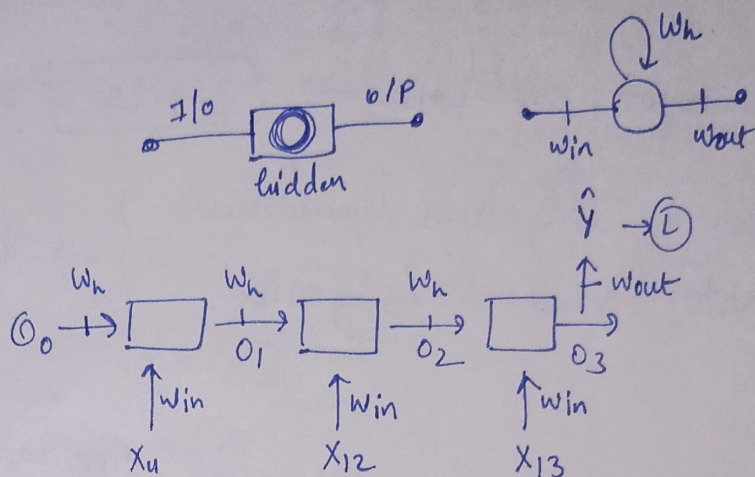
→ possible solution

{ exploding gradient problem } → RNN struggles -

#

- problem #1 \Rightarrow problem of long term dependency
 \hookrightarrow Vanishing gradient problem

Input	output
$\begin{bmatrix} 1 & 0 & 1 \\ 0 & 0 & 1 \\ 0 & 0 & 0 \\ 1 & 1 & 1 \end{bmatrix}$	$\begin{bmatrix} 1 \\ 0 \\ 0 \\ 1 \end{bmatrix}$
3 time stamps	



back propagation \rightarrow $\mathcal{L} \rightarrow \min$

w_h, w_{in}, w_{out}

\downarrow
Gradient Descent

$$w_{in} = \underline{w_{in}} - \eta \left[\frac{\partial \mathcal{L}}{\partial w_{in}} \right]$$

$$w_{out} = \underline{w_{out}} - \eta \left[\frac{\partial \mathcal{L}}{\partial w_{out}} \right]$$

$$w_h = \underline{w_h} - \eta \left[\frac{\partial \mathcal{L}}{\partial w_h} \right]$$

Isko nikalne ka
 sbse bdaa contribution
 short term wala ka
 hoga hai

$$\frac{\partial \mathcal{L}}{\partial \min} = \left[\frac{\partial \mathcal{L}}{\partial \hat{y}} \frac{\partial \hat{y}}{\partial o_3} \frac{\partial o_3}{\partial w_{in}} \right] + \left[\frac{\partial \mathcal{L}}{\partial \hat{y}} \frac{\partial \hat{y}}{\partial o_3} \frac{\partial o_3}{\partial o_2} \frac{\partial o_2}{\partial w_{in}} \right] +$$

Short term dependencies.

$$\left[\frac{\partial \mathcal{L}}{\partial \hat{y}} \frac{\partial \hat{y}}{\partial o_3} \frac{\partial o_3}{\partial o_2} \frac{\partial o_2}{\partial o_1} \frac{\partial o_1}{\partial w_{in}} \right]$$

long term dependencies

for 100 time stamps \div

$$\hookrightarrow \left[\frac{\partial \mathcal{L}}{\partial \hat{y}} \frac{\partial \hat{y}}{\partial o_{100}} \frac{\partial o_{100}}{\partial o_{99}} \dots \frac{\partial o_2}{\partial o_1} \frac{\partial o_1}{\partial w_{in}} \right]$$

means \div

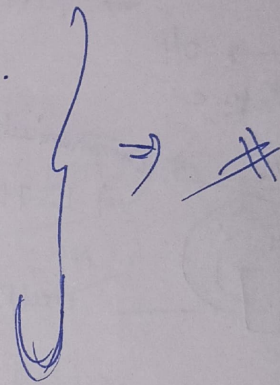
Jitna jyada time stamps
 hoga utna hi chote
 humara long term dependencies
 hongi !!

$$\left[\frac{\partial L}{\partial \hat{y}} \frac{\partial \hat{y}}{\partial O_{100}} \frac{\partial O_{100}}{\partial O_{99}} \dots \frac{\partial O_2}{\partial O_1} \frac{\partial O_1}{\partial W_{in}} \right] \xrightarrow{\text{Generalize}} \frac{\partial L}{\partial \hat{y}} \frac{\partial \hat{y}}{\partial O_{100}} \prod_{t=2}^{100} \left(\frac{\partial O_t}{\partial O_{t-1}} \right) \frac{\partial O_1}{\partial W_{in}}$$

$$\rightarrow \frac{\partial O_2}{\partial O_1} \frac{\partial O_3}{\partial O_2} \frac{\partial O_4}{\partial O_3} \dots \frac{\partial O_{100}}{\partial O_{99}}$$

Solution to Reduce this problem?

- 1) Diff Activation \rightarrow Relu / leaky relu.
- 2) Better weight initialization.
- 3) Skip rnn's.
- 4) LSTM =



\Rightarrow problem # 2 \rightarrow unstable Training (Exploding Gradients) $\frac{?}{?}$
 \hookrightarrow training hote hi nhi hai.

- 1) Gradient clipping
- 2) Control learning rate
- 3) LSTM