

[4x4]

$$Q(k, k+1) = Q(dt) \quad \text{Variance matrix at step } k \rightarrow k+1$$

[4x4]

$$F_{(k, k+1)} = F(dt) \quad \text{state transition matrix}$$

Take last known state  $X_k = \begin{pmatrix} x \\ \dot{x} \\ \ddot{x} \\ \vdots \\ \ddot{\ddot{x}} \end{pmatrix}$  & project it ahead in time using the transition matrix.

Ignore as this comes from the environment

$$X_{(k+1)} = F_{(k, k+1)} \cdot X_{(k)} + \underbrace{B \cdot W(k)}_{[4x4] [4x1]}$$

Project the error covariance ahead note  $P(k, k+1)$  is the covariance matrix at step  $k \rightarrow k+1$ ,  $P(k-1, k)$  same for  $k-1 \rightarrow k$ .

$$P_{(k, k+1)} = F_{(k, k+1)} \cdot P_{(-k, k)} \cdot F_{(k, k+1)}^T + Q(k, k+1)$$

? not  $(k-1, k)$  sense anyway

Calculate uncertainty in measurement + uncertainty in estimate:

where  $H$  is the measurement matrix &  $R$  is the measurement uncertainty

$$S = H \cdot P_{(k, k+1)} \cdot H^T + R$$

$\underbrace{[1 \times 4] \quad [4 \times 4]}_{[1 \times 4]} \quad [4 \times 1] \quad [1 \times 1]$   
 $[1 \times 1] + [1 \times 1] = [1 \times 1]$

calculate uncertainty in estimate

$$C = P_{(k, k+1)} \cdot H^T$$

$[4 \times 1] \quad [4 \times 4] \quad [4 \times 1]$

calculate the gain

$$K = (-S)^{-1}$$

$[4 \times 1] \quad [4 \times 1] \quad [1 \times 1]$

Update measurement vector  $Z$

$$Z = Z \cdot \text{reshape}(H \cdot \text{shape}(O), 1) \quad [1 \times 1] \text{ in } 1d$$

Carry the innovation

$$Y = Z - (H \cdot X_{(n+1)})$$
$$[1 \times 1] - (\underline{[1 \times 4]} \underline{[4 \times 1]}) = [1, 1]$$

Calculate the filtered state

Kalman

$$X_{(n+1)} = X_{(n+1)} + k \cdot Y$$
$$[4 \times 1] \quad [4 \times 1] \quad [1 \times 1]$$

Assign old to new state

$$X_{(n)} = X_{(n+1)} + (k \cdot Y)$$
$$[4 \times 1] \quad [4 \times 1] \quad [1 \times 1]$$
$$[4 \times 1] \quad [4 \times 1]$$

Update error covariance

$$P_{(k, n)} = (1 - k \cdot H) \cdot P_{(n, n+1)}$$
$$[4 \times 4] \quad [4 \times 4] \quad [4 \times 1] [1 \times 4] \quad [4 \times 4]$$
$$[4 \times 4] \quad [4 \times 4] = [4 \times 4]$$

$k+1$  then loop for next stage.

So need a simple 1D non generic version which can be copied quickly.

$$Q(dt) = \begin{bmatrix} \frac{dt^7}{286} & \frac{dt^6}{72} & \frac{dt^5}{30} & \frac{dt^4}{24} \\ \frac{dt^6}{72} & \frac{dt^5}{20} & \frac{dt^4}{8} & \frac{dt^3}{5} \\ \frac{dt^5}{30} & \frac{dt^4}{8} & \frac{dt^3}{3} & \frac{dt^2}{2} \\ \frac{dt^4}{24} & \frac{dt^3}{6} & \frac{dt^2}{2} & dt \end{bmatrix}$$

$$\sigma^2 = \checkmark$$

$$P(dt) = \begin{bmatrix} \delta_0^2 & \frac{\delta_0^2}{dt} & \frac{\delta_0^2}{dt^2} & 0 \\ \frac{\delta_0^2}{dt} & \frac{2\delta_0^2}{dt^2} & \frac{3\delta_0^2}{dt^3} & \frac{5\delta_J^2}{6} dt^2 \\ \frac{\delta_0^2}{dt^2} & \frac{3\delta_0^2}{dt^3} & \frac{6\delta_0^2}{dt^4} & \delta_J^2 dt \\ 0 & \left[ \frac{5\delta_J^2}{6} dt^2 \right] \delta_J^2 dt & \delta_J^2 \end{bmatrix}$$

$$F(dt) = \begin{bmatrix} 1 & dt & \frac{dt^2}{2} & \frac{dt^3}{6} \\ 0 & 1 & dt & \frac{dt^2}{2} \\ 0 & 0 & 1 & dt \\ 0 & 0 & 0 & 1 \end{bmatrix}$$

To simplify this we could just use the components of  $P, F \& Q$   
as e.g.  $P_{ij}(dt)$  & sub them in later.

Step by step:  $\log t = k$

$$[F_{ij}]_k = F(dt_k) = \begin{bmatrix} F_{11} & F_{12} & F_{13} & F_{14} \\ F_{21} & F_{22} & F_{23} & F_{24} \\ F_{31} & F_{32} & F_{33} & F_{34} \\ F_{41} & F_{42} & F_{43} & F_{44} \end{bmatrix}$$

$$[Q_{ij}]_k = Q_k = \begin{bmatrix} Q_{11} & Q_{12} & Q_{13} & Q_{14} \\ Q_{21} & Q_{22} & Q_{23} & Q_{24} \\ Q_{31} & Q_{32} & Q_{33} & Q_{34} \\ Q_{41} & Q_{42} & Q_{43} & Q_{44} \end{bmatrix}$$

solve with  $[P_{ij}]_k$

$[4 \times 1]$

We start with state  $X^{(k)} = [X_1^{(k)} \ X_2^{(k)} \ X_3^{(k)} \ X_4^{(k)}]$

$[4 \times 1]$

$[4 \times 4] \quad [4 \times 1]$

1) P gives  $X^{(k+1)} = F X^{(k)}$

$$\Rightarrow [X_{11}^{k+1}, X_{12}^{k+1}, X_{13}^{k+1}, X_{14}^{k+1}] \begin{bmatrix} F_{11} & F_{12} & F_{13} & F_{14} \\ F_{21} & F_{22} & F_{23} & F_{24} \\ F_{31} & F_{32} & F_{33} & F_{34} \\ F_{41} & F_{42} & F_{43} & F_{44} \end{bmatrix}$$

T

$$\Rightarrow \begin{bmatrix} X_{11}^{k+1} F_{11} dt + X_{12}^{k+1} F_{21} dt + X_{13}^{k+1} F_{31} dt + X_{14}^{k+1} F_{41} \\ X_{11}^{k+1} F_{12} dt + X_{12}^{k+1} F_{22} dt + X_{13}^{k+1} F_{32} dt + X_{14}^{k+1} F_{42} \\ X_{11}^{k+1} F_{13} dt + X_{12}^{k+1} F_{23} dt + X_{13}^{k+1} F_{33} dt + X_{14}^{k+1} F_{43} \\ X_{11}^{k+1} F_{14} dt + X_{12}^{k+1} F_{24} dt + X_{13}^{k+1} F_{34} dt + X_{14}^{k+1} F_{44} \end{bmatrix} \quad [4 \times 1]$$

$$F(dt_n)^T = \begin{bmatrix} F_{11} & F_{21} & F_{31} & F_{41} \\ F_{12} & F_{22} & F_{32} & F_{42} \\ F_{31} & F_{23} & F_{33} & F_{43} \\ F_{14} & F_{24} & F_{34} & F_{44} \end{bmatrix}$$

2) right error cover ahead.

$$P_{(k+1)} = F_{(n)} P_{(k-1)} F_{(n)}^T + Q_{(k)}$$

$$\begin{bmatrix} F_{11} & F_{12} & F_{13} & F_{14} \\ F_{21} & F_{22} & F_{23} & F_{24} \\ F_{31} & F_{32} & F_{33} & F_{34} \\ F_{41} & F_{42} & F_{43} & F_{44} \end{bmatrix} \begin{bmatrix} P_{11}^{k-1} & P_{12}^{k-1} & P_{13}^{k-1} & P_{14}^{k-1} \\ P_{21}^{k-1} & P_{22}^{k-1} & P_{23}^{k-1} & P_{24}^{k-1} \\ P_{31}^{k-1} & P_{32}^{k-1} & P_{33}^{k-1} & P_{34}^{k-1} \\ P_{41}^{k-1} & P_{42}^{k-1} & P_{43}^{k-1} & P_{44}^{k-1} \end{bmatrix} \begin{bmatrix} F_{11} & F_{21} & F_{31} & F_{41} \\ F_{12} & F_{22} & F_{32} & F_{42} \\ F_{31} & F_{23} & F_{33} & F_{43} \\ F_{14} & F_{24} & F_{34} & F_{44} \end{bmatrix} + \begin{bmatrix} Q_{11} & Q_{12} & Q_{13} & Q_{14} \\ Q_{21} & Q_{22} & Q_{23} & Q_{24} \\ Q_{31} & Q_{32} & Q_{33} & Q_{34} \\ Q_{41} & Q_{42} & Q_{43} & Q_{44} \end{bmatrix}$$

Need a symbolic solver for this gonna be unwieldy!

2/4/23

SymPy solver for kalman process.

3/4/23

Need dependency graph.

$$P_{k+2} = (I - K H) P_{k+1} \quad * \text{ need for next loop}$$

$$X_{k+1}^{\text{KALMAN}} = X_{k+1} + \begin{pmatrix} K \\ Y \end{pmatrix} \quad * \text{ final state}$$

↳ also taken as final state.

Dependencies...

$$Y = Z - (H X_{k+1})$$

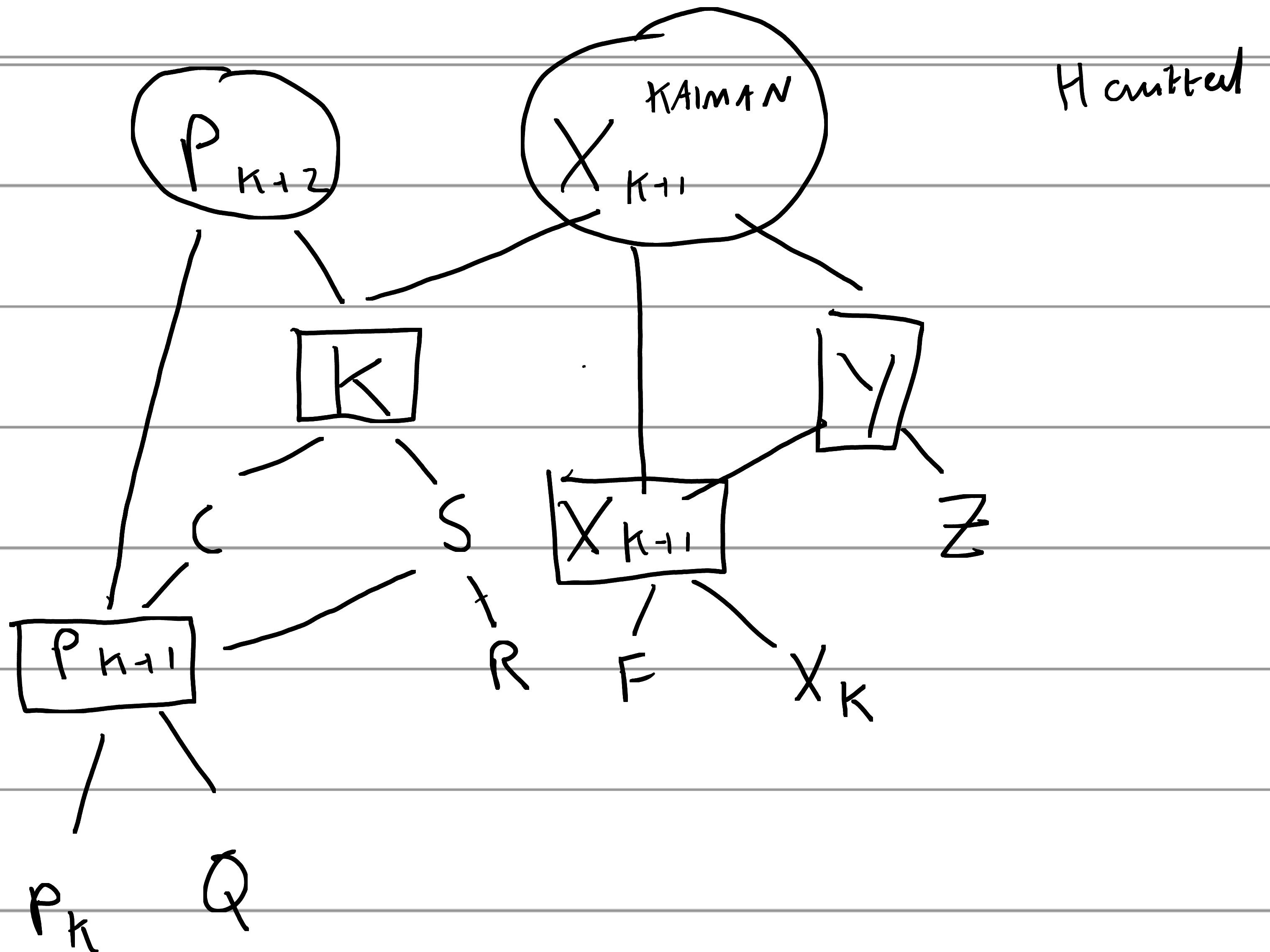
→ last state (Kalman?)

ds  
Z comes from new input  
recalculated via H

$$K = C S^{-1}$$

$$C = P_{k+1} H^T \quad S = H P_{k+1} H^T + R$$

$$P_{k+1} = F P F^T + Q \quad X_{k+1} = F X_k$$



KALMAN

Each cycle we need  $P_{k+2} \leftarrow X_{k+1} \rightarrow$  what common computation can we leverage?

Need  $P_{k+1}$ ,  $X_{k+1}$ ,  $\leftarrow Y$  then compute

the "rest" in terms of them

$$\begin{bmatrix} P_{k+1,1} & P_{k+1,2} & R_{k+1,3} & \dots & \text{etc} \\ \vdots & \vdots & \vdots & \ddots & \vdots \end{bmatrix}$$

$\hookrightarrow P_{k+2}, X_{k+1}^{\text{KALMAN}} \rightarrow P_{k+1}, X_{k+1}$

can generate error from this.

4/4/23

Missing error last state

10/4/23

first version of cpp... need option for absolute/relative

time.

need python bindings. ✓

11/4/23

Cleanup unnecessary files Kahan1D.cpp

params include time absolute/relative

Clean up O.O unnecessary computations.

++ test

rm stdout

check fopen / fmod operations

auto model optimizer. inputs computed outputs consider shapes

(symbols)

Type dys

17/4/23

Cleaned up & harmonised py & cython Kalman class.

added args for selectable time

testing against old double precision code

cpp code works but PyKalman & CyKalman behave differently

based on input params.

Can get same smoothing but with different args. cython version much smaller alpha needed.

Might not matter but would be nice to have almost exactly the same behavior between Pykal & Cykal

Model for white noise acceleration might be considerably simpler.

Next rotary sensor

24/4/23

Todo optimise kalman loops.

Vm start out prints

create iso without sensor final frequency at which we are sampling.

$$2^{12} = 4096$$

$$\text{rpm} / 60 = \text{Hz}$$

$$\underline{\text{Sample rate}} \times 60 = \text{max rpm}$$

Encoder res

High speed

260 Hz

78 rpm

33.3 rpm

1.3 Hz

0.0556 Hz

↓  
101x

1.43

call it 1.5 Hz

12.5 Hz

16.6 Hz

60 Hz

33.3 → 780

58.3 Hz

CCW

780 idle

1000 steps

6000 revs

2 → 3 k counts

3500 K coarse

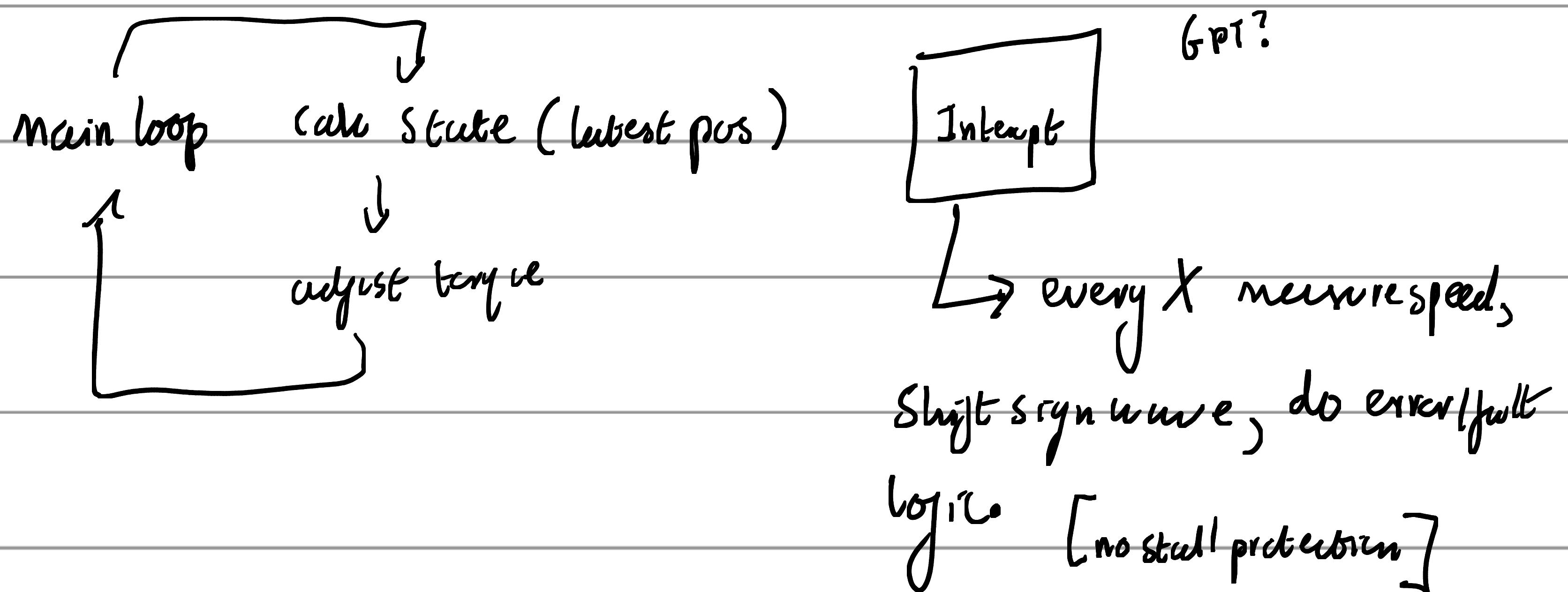
$$\underline{\text{Sample rate needed}} = \text{max rpm needed} \times \text{enc res} = \text{max Hz needed} \times \text{enc res}$$

60

$$\text{sample} ( \text{max Hz} = 1.5 ) = 6144 \text{ Hz}$$

Doubtlessly 10 will be able to do more than a few 1000's Kalman points per second.

In order to make sure we move the wave forward enough to not disrupt motion need to separate at the process of speed calc & enc sampling



what is  $X$ ? well preferably its enough to ensure we update the wave for each possible encoder position. what's that value?

$$\text{Sample rate} = \frac{\text{rotations per second} \times \text{enc res}}{60} = \frac{\text{rpm} \times \text{enc res}}{60}$$

lets say we define mid speed as 6000 rpm,  $\frac{100}{Hz}$  so we need 100000 Hz

which leaves quite a bit from the 10MHz old log time for doing measurements

$$\frac{400,000}{1,000,000} = 0.37\% \text{ so we have } 62\% \text{ of the time for speed calc.}$$

optimising code abs 1e6 results install hyperfine

hyperfine --numup 3 " (cmd)

best of 5 1.17s

$\bar{x}$  1.174

1.155

1.21

1.23

1.11



pose optimisation rm (0.0)

1.05

$\bar{x}$  1.016

1.08

1% inc/age.

1.09

1.08

1.1

close to Kuepet

vee  
tenue get junctions Kulam state X

vee  
ester stable

covalent mix P ✓.