# Battery electric vehicle application, scenario 2



- Asymptotic quality of total capacity estimates limited by noise on the SOC estimates used by the algorithms
- If this noise can be reduced, total capacity estimates can become more accurate
- BEV application allows a means to do this: whenever battery pack is fully charged, we have a precisely known end-point SOC
- Therefore, either  $z(t_1)$  or  $z(t_2)$  can be known "exactly" for every total-capacity estimate update
- This then allows us to use  $\sigma_{x_i}^2 = \sigma_z^2 = (0.01)^2$

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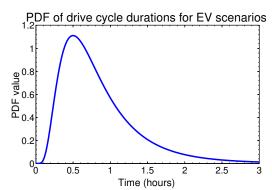
Battery State-of-Health (SOH) Estimation | How to write code for the different total-capacity estimators 1 of 7

4.4.5: Demonstrating Octave code for BEV: Scenarios 2-3

# Battery electric vehicle application, scenario 2



- Tradeoff: no longer have regular updates; updates happen randomly, whenever vehicle is charged
- $\blacksquare$  So,  $m_i$  becomes a random variable
- $\blacksquare$  Here,  $m_i$  has log-normal pdf with mode 0.5 h, standard deviation 0.6 h
  - Gives reasonable-duration drive cycles with variety of driving distances
- As more battery energy would be used for a full drive cycle than for a regular periodic update, use 80 % SOC range, so  $x_i$  simulated as uniform random number between  $\pm 0.8$



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4.4.5: Demonstrating Octave code for BEV: Scenarios 2-3

# Battery electric vehicle application, scenario 2



Code for this scenario presented below: biggest change is inclusion of parameters for random intervals between updates

```
Q0 = 100;
            % actual new-cell capacity of cell
                % must be able to measure current up to +/- maxI
maxI = 5*Q0;
precisionI = 1024; % 10-bit precision on current sensor
slope = 0;
Qnom = 0.99*Q0;  % ** nominal capacity, used for init. of recursive methods
xmax = 0.8; xmin = -xmax; % ** range of the x(i) variables
mode = 0.5; sigma = 0.6; % ** needed for case 2
socnoise = 0.01;  % ** standard deviation of x(i)
Gamma = 1;
                 % forgetting factor
plotTitle = 'EV Scenario 2';
runScenario
```

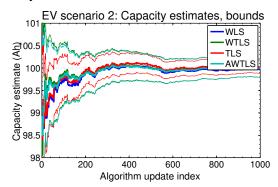
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#### Results for BEV scenario 2



- WLS fails once again, but this time TLS also fails because  $\sigma_{x_i} \neq k \sigma_{y_i}$  due to the variable-length drive cycles
- TLS estimate actually quite reasonable, (but goodness of fit is very small)
- WTLS good; AWTLS best due to lower error bounds because of the ability to initialize the estimate
- Asymptotic three-sigma bounds drop from about  $\pm 1 \%$  to about  $\pm 0.15 \%$  of total capacity due to having lower value of  $\sigma_{x_i}$  and due to wider range in  $x_i$



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## Battery electric vehicle application, scenario 3



- The final scenario we consider is identical to BEV scenario 2, except that we simulate a changing total capacity
- The slope of the total capacity curve is chosen to be -0.01 Ah per measurement update, and  $\gamma = 0.98$  was used

```
% actual new-cell capacity of cell
Q0 = 100;
maxI = 5*Q0;
                 \% must be able to measure current up to +/- maxI
precisionI = 1024; % 10-bit precision on current sensor
xmax = 0.8; xmin = -xmax; % range of the x(i) variables
theCase = 2; % random interval between updates
mode = 0.5; sigma = 0.6; % needed for case 2
socnoise = 0.01; % standard deviation of x(i)
Gamma = 0.98: % ** forgetting factor
Gamma = 0.98;
                 % ** forgetting factor
plotTitle = 'EV Scenario 3';
runScenario
```

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4.4.5: Demonstrating Octave code for BEV: Scenarios 2-3

## Results for BEV scenario 3



- Representative results of this scenario are presented to right
- Once again, WLS fails due to too-tight error bounds and TLS is uncertain of its estimate for nearly 100 updates
- However, TLS does recover and do quite well
- AWTLS method gives the best results

EV scenario 3: Capacity estimates, bounds 103 WLS 102 WTLS 101 TLS AWTLS 97 96 95 94 93 92 91 90 800 Algorithm update index

## Summary



- Have now seen three HEV and three BEV scenarios
- The different algorithms have different characteristics
- We will discuss some general observations next lesson
- Here, we notice an improvement in estimates and error bounds due to a calibrated SOC estimate at "one end" of a driving cycle, enabled by the BEV application
- We also notice again the failure of WLS, and success of AWTLS

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