

segment speed estimation

concept

more accurate to estimate for each segment, by breaking into components:

travel time = (stop time) + (acceleration time) + (deceleration time) + (time spent averaging a practical top speed)

where practical top speed = $\frac{\text{nominal top speed}}{\text{terrain difficulty coefficient}}$

part 1: acceleration

given

v_{\max} = practical top speed (m/s)

m = mass of train (kg)

P = traction power (W)

F = max tractive effort (N)

find

t_{acc} = time to accelerate to v_{\max}

d_{acc} = distance to accelerate to v_{\max}

$v_{\text{avg_acc}}$ = average speed over d_{acc}

intermediates

v_1 = max v where F can be applied

$P = Fv_1$

$v_1 = P/F$

(equation 1.1.1)

t_1 = time when v_1 reached

$F = ma$

$a = v_1/t_1$

$F = m \cdot (v_1/t_1)$

$t_1 = m \cdot (v_1/F)$

$t_1 = m \cdot (P/F^2)$

(equation 1.1.2)

$t' = t - t_1$

derive

ref:

<https://physics.stackexchange.com/questions/350153/formula-to-determine-acceleration-based-on-constant-energy-input>

https://kb.osu.edu/bitstream/handle/1811/2458/V30N04_218.pdf

assuming constant power:

$$P = \frac{dE}{dt} = \frac{d}{dt} \left(\frac{1}{2} m v^2 \right) = \frac{1}{2} m \frac{dv^2}{dt} = m v \frac{dv}{dt}$$

$$\int \frac{P}{m} dt = \int v dv$$

$$\frac{Pt}{m} = \frac{1}{2} v^2 + C$$

with initial velocity v_0 : ($C = -\frac{1}{2} v_0^2$)

$$v = \sqrt{v_0^2 + 2Pt/m}$$

for $t \leq t_1$: accel limited by F

$$v = at$$

$$v = Ft/m$$

(equation 1.2.1)

$$t = mv/F$$

(equation 1.2.2)

$$d = \int_{(0,t)} (v(t)) dt$$

$$d = \int_{[0,t]} ((F/2m)(t^2))$$

$$d = (F/2m)t^2$$

(equation 1.2.3)

for $t > t_1$: accel limited by P

$$\text{let } t' = t - t_1$$

$$v = \sqrt{v_1^2 + 2P(t-t_1)/m}$$

(equation 1.2.4)

$$v = \sqrt{v_1^2 + 2Pt'/m}$$

$$d = \int_{(0,t')} (v(t')) dt'$$

(<https://www.integral-calculator.com/>)

$$d = \frac{m \cdot \left(\left(\frac{2Pt' + am}{m} \right)^{3/2} - v_1^{3/2} \right)}{3P}$$

$$d = \frac{m \cdot \left(\left(\frac{2P(t-t_1) + am}{m} \right)^{3/2} - v_1^{3/2} \right)}{3P}$$

(equation 1.2.5)

$$v^2 = v_1^2 + 2P(t-t_1)/m$$

$$m(v^2 - v_1^2) = 2P(t-t_1)$$

$$t = \frac{m(v^2 - v_1^2)}{2P} + t_1$$

(equation 1.2.6)

eg.

$$m = 515 \text{ t} = 467200 \text{ kg}$$

$$P = 3900 \text{ hp} = 2908229 \text{ W}$$

$$F = 65000 \text{ lbf} = 289134.4 \text{ N}$$

$$v_1 = P/F = 10.058 \text{ m/s} = 22.499 \text{ mph}$$

$$t_1 = m/(P/F) = 16.253 \text{ s}$$

$$\text{let } v = 30 \text{ mph} = 13.411 \text{ m/s}$$

$$t_{\text{acc}} = \frac{m(v^2 - v_1^2)}{2P} + t_1 = 28.892 \text{ s (to reach 30 mph)}$$

+air resistance at high speeds

the above works well for finding t and d required to accelerate up to a low v_{max}

but for high v_{max}, t and d much larger due to negative power exerted by aerodynamic drag

$$P_d = \frac{1}{2} \rho v^3 A C_d$$

ρ = density of fluid (assume constant)

A = frontal area (assume constant)

C_d = coefficient of drag (assume constant)

the constants of drag

ref:

https://en.wikipedia.org/wiki/Density_of_air#:~:text=The%20density%20of%20air%20or.atmospheric%20pressure%2C%20temperature%20and%20humidity

$$\rho = 1.2041 \text{ kg/m}^3 \text{ (dry air @ 20 °C and 101.325 kPa)}$$

A = cross-section height * width (largest between locomotive and carriages)

C_d : start with 1; can only be obtained by simulation, or tuning t/v/d functions to match real data

abstract by calculating a single constant:

$$D = \frac{1}{2} \rho A C_d$$

(equation 1.3.1)

$$P_d = Dv^3$$

originally, P only accounted for traction power

now, accounting for P_d

$$P_{\text{tot}} = P_{\text{trac}} - P_d$$

$$\frac{P_{\text{tot}} t}{m} = \frac{1}{2} v^2 + C$$

$$\frac{(P_{\text{trac}} - P_d) t}{m} = \frac{1}{2} v^2 + C$$

$$\frac{(P_{\text{trac}} - Dv^3) t}{m} = \frac{1}{2} v^2 + C$$

$$t = \frac{m(\frac{1}{2} v^2 + C)}{P_{\text{trac}} - Dv^3}$$

for $t \leq t_1$: accel limited by F

assume same v , t , d as previous— force of drag is insignificant for small v

for $t > t_1$: accel limited by P

then assume $t' = t - t_1$, $v_0 = v_1$

(from earlier $C = -\frac{1}{2} v_0^2$)

solving for C

$$t' = \frac{m(\frac{1}{2} v^2 + C)}{P_{\text{trac}} - Dv^3}$$

at $t = t_1$, $v = v_1$

at $t' = 0$, $v = v_1$

$$0 = \frac{m(\frac{1}{2} v_1^2 + C)}{P_{\text{trac}} - Dv_1^3}$$

$$C = -\frac{1}{2} v_1^2$$

now plug C back in:

$$t' = \frac{m(\frac{1}{2} v^2 - \frac{1}{2} v_1^2)}{P_{\text{trac}} - Dv^3}$$

$$t = \frac{m(v^2 - v_1^2)}{2(P_{\text{trac}} - Dv^3)} + t_1$$

(equation 1.3.2)

note this is same as before but with $P_{\text{tot}} = P_{\text{trac}} - P_d$

solving for v by hand is impossible

provide: m , P_{trac} , D

calculate: t , t_1 , v_1

then plug in and use polynomial solver:

$$\frac{m(v^2 - v_1^2)}{2(P_{trac} - Dv^3)} + t_1 - t = 0$$

$$mv^2 - mv_1^2 + 2P_{trac}t_1 - 2P_{trac}t - 2Dv^3t_1 + 2Dv^3t = 0$$

$$(2Dt - 2Dt_1)v^3 + mv^2 - mv_1^2 + 2P_{trac}t_1 - 2P_{trac}t = 0$$

$$2D(t - t_1)v^3 + mv^2 - mv_1^2 + 2P_{trac}(t_1 - t) = 0$$

$$av^3 + bv^2 + c = 0$$

where coefficients

$$a = 2D(t - t_1)$$

$$b = m$$

$$c = -mv_1^2 + 2P_{trac}(t_1 - t)$$

(equation 1.3.3)

use the above to create a function in python, v(t), and use python to estimate:

$$d(t) = \int_0^t v(t) dt$$

(equation 1.3.4)

part 2: deceleration

concept

ref: <http://www.railway-technical.com/books-papers--articles/high-speed-railway-capacity.pdf>

“A more realistic approach is by Hunyadi (2011), who proposes a series of braking rates that vary with speed”

given

a_1 = deceleration rate (m/s^2) from v_1 (m/s) down to v_0 (m/s)

a_2 = deceleration rate from v_2 down to v_1

...

a_n = deceleration rate from v_n down to v_{n-1}

$$v_0 = 0$$

v_{max} = practical top speed (m/s) = initial speed

find

t_{brake} = time to brake from v_{max}

d_brake = distance to brake from v_{max}

deceleration

$$a(v) = \begin{cases} 0 & \text{for } v = 0 \\ a_1 & \text{for } 0 < v \leq v_1 \\ a_2 & \text{for } v_1 < v \leq v_2 \\ \dots \\ a_n & \text{for } v_{n-1} < v \leq v_n \end{cases}$$

time

given $v_{n-1} < v_{\max} \leq v_n$:

t_n = time to reach v_{n-1}

$$t_n = (v_{\max} - v_{n-1})/a_n$$

$$t_{n-1} = (v_{n-1} - v_{n-2})/a_{n-1} + t_n$$

$$t_{n-2} = (v_{n-2} - v_{n-3})/a_{n-2} + t_{n-1}$$

...

$$t_1 = (v_1 - v_0)/a_1 + t_2$$

t_{stop} = total time to stop = t_1

speed

$$v(t) = \begin{cases} v_{\max} - a_n t & \text{for } 0 < t < t_n \\ v_{n-1} - a_{n-1} t & \text{for } t_n < t < t_{n-1} \\ v_{n-2} - a_{n-2} t & \text{for } t_{n-1} < t < t_{n-2} \\ \dots \\ v_1 - a_1 t & \text{for } t_2 < t < t_1 \\ v_0 & \text{for } t > t_1 \end{cases}$$

dist

$$\text{distance to stop} = d(t_1) = \int_0^{t_n} (v_{\max} - a_n t) dt + \int_{t_n}^{t_{n-1}} (v_{n-1} - a_{n-1} t) dt + \dots$$

simpler case: only two rates

a_1 = deceleration rate (m/s²) from v_1 (m/s) down to v_0 (m/s)

a_2 = deceleration rate for v above v_1

v_{\max} = initial speed

time to stop = t_{stop}

= {

t_1 (time to stop from v_{\max}) for ...

t_2 (time to slow from v_{\max} to v_1) + t_1 (time to stop from v_1) for ...

= {

$v_{\max}(1/a_1)$ for $v_{\max} < v_1$

$(v_{\max} - v_1)(1/a_2) + v_1(1/a_1)$ for $v_{\max} > v_1$

(equation 2.1.1)

undefined for $v_{\max} \leq 0$ "error: v_{\max} must be positive"

$t' = (\text{time to slow from } v_{\max} \text{ to } v_1) = t_2 - t' = (v_{\max} - v_1)(1/a_2)$

distance to stop = d_{stop}

= {

d_1 (distance to stop from v_1) for ...

d_2 (distance to slow from v_{\max} to v_1) + d_1 (distance to stop from v_1) for ...

ref:

<https://stackoverflow.com/questions/63085071/constant-acceleration-movement-with-minus-acceleration>

(to get d from a : $d = v_0t + \frac{1}{2}at^2$)

= {

$0 + \frac{1}{2}a_1t_1^2$ for ...

$v_1t' + \frac{1}{2}a_2t'^2 + \frac{1}{2}a_1t_1^2$ for ...

= {

$\frac{1}{2}a_1(v_{\max}/a_1)^2$ for ...

$v_1((v_{\max} - v_1)(1/a_2)) + \frac{1}{2}a_2((v_{\max} - v_1)(1/a_2))^2 + \frac{1}{2}a_1(v_1/a_1)^2$ for ...

= {

$\frac{1}{2}(v_{\max}^2/a_1)$ for $v_{\max} < v_1$

$v_1(v_{\max} - v_1)(1/a_2) + \frac{1}{2}((v_{\max} - v_1)^2(1/a_2)) + \frac{1}{2}(v_1^2/a_1)$ for $v_{\max} > v_1$

(equation 2.1.2)

speed at time $t = v$

if $v_{\max} < v_1$:

$v = \max(0, v_{\max} - a_1t)$

(equation 2.1.3)

if $v_{\max} > v_1$:

$$v = \max(0, \{ \\ v_{\max} - a_2 t \text{ for } t < t_1 \\ v_1 - a_1(t - t_1) \text{ for } t > t_1 \\ \})$$

$$= \{ \\ v_{\max} - a_2 t \text{ for } t < t_1 \\ \max(0, (v_1 - a_1(t - t_1))) \text{ for } t > t_1 \\ \}$$

$$\text{where } t_1 = \Delta v(1/a_1)$$

$$= (v_{\max} - v_1)(1/a_1)$$

(equation 2.1.4)

eg. for Amtrak Bi-Level passenger cars

ref (p.37):

https://web.archive.org/web/20160306083948/http://www.highspeed-rail.org/Documents/PRIIA_Bi-Level_Spec_305-001_Approved_rev%20C.1.pdf

“Braking rates: Full service: minimum of 1.35 miles per hour per second (mphps) (2.17 km/hr/s) deceleration from 125 mph (201 km/hr) down to 70 mph (113 km/hr), then increasing to not less than 2 miles per hour per second (mphps) (3 km/hr/s) average below 70 mph (113 km/hr)”

$$a_2 = 1.35 \text{ mph/s} = 0.60 \text{ m/s}^2$$

$$a_1 = 2 \text{ mph/s} = 0.89 \text{ m/s}^2$$

$$v_2 = 125 \text{ mph} = 55.88 \text{ m/s}$$

$$v_1 = 70 \text{ mph} = 31.29 \text{ m/s}$$

$$v_0 = 0 \text{ m/s}$$

(constants 2.1.5)

part 3: stop-to-stop estimation

concept

given two consecutive stops S_A and S_B , find the arrival-to-arrival travel time from S_A to S_B (or vice versa)

given

v_{\max} = practical top track speed (m/s)

calculate from earlier: t_{acc} , d_{acc} ; t_{brake} , d_{brake}

t_{dwell} = dwell time at S_A or S_B (assume same for either) (t)

d_{total} = track distance between S_A or S_B (m)

$$d_{\text{total}} = d_{\text{acc}} + d_{\text{vmax}} + d_{\text{brake}}$$

find

t_{total} = total arrival-to-arrival travel time from S_A to S_B (assume equal for vice versa)

v_{avg} = average speed from S_A to S_B

intermediates

$d_{v_{\text{max}}}$ = distance traveled at v_{max}

$d_{v_{\text{max}}} = d_{\text{total}} - d_{\text{acc}} - d_{\text{brake}}$

(equation 3.1.1)

$t_{v_{\text{max}}}$ = time traveled at v_{max}

$t_{v_{\text{max}}} = d_{v_{\text{max}}} / v_{\text{max}}$

(equation 3.1.2)

tying it all together

$t_{\text{total}} = t_{\text{dwell}} + t_{\text{acc}} + t_{v_{\text{max}}} + t_{\text{brake}}$

(equation 3.2.1)

$v_{\text{avg}} = d_{\text{total}} / t_{\text{total}}$

(equation 3.2.2)

catch: constrained by d_{total}

$d_{\text{total}} = d_{\text{acc}} + d_{v_{\text{max}}} + d_{\text{brake}}$

d_{acc} and d_{brake} are w.r.t. v_{max}

property: $d_{v_{\text{max}}}$ must be non-negative

property that follows: $d_{\text{acc}} + d_{\text{brake}} \leq d_{\text{total}}$

(property 3.3.1)

practically, this means can only reach a speed of v_{max} if the distance required to accelerate to v_{max} , plus the distance required to brake from v_{max} to a stop, is less than the total distance between the two stops

before, v_{max} was defined by other factors: track conditions, curves, grades etc

but now, must also consider d_{tot} constraint on d_{acc} and d_{brake} , and thus v_{max}

adjustment algorithm

if v_{max} provided is too high, it must be lowered to satisfy: $d_{\text{acc}} + d_{\text{brake}} \leq d_{\text{total}}$

due to the complexity of d_{acc} and d_{brake} w.r.t. v_{max} , it may not be feasible to solve for optimal v_{max}

instead, insert a **brute force** adjustment of v_{max} :

while not($d_{\text{acc}} + d_{\text{brake}} \leq d_{\text{total}}$):

lower v_{\max} by a constant factor (eg. 0.5%)
recalc d_{acc} , d_{brake}

break after certain number of iterations, eg. 100, in case of bad params (eg. unit conversion errors)

(algorithm 3.3.2)

(old, ignore) segment speed estimation

concept

within a segment, the closer the (highest) speed limit is to the service max speed, the lower average speed is expected relative to that speed limit; estimating for dwell/ accel/ decel times, lesser speed limits, curves, grades

eg: on a segment of regional service (max 100), if the highest speed limit is 100: estimated average speed = 50

but if the highest speed limit is 60, estimated average speed = 42

given

p = segment length (pixels), measured

v = highest speed limit within segment

m = service max speed

c = loss coefficient ($[0, 1]$, higher = slower)

high speed: $c = 0.375$ (~25% faster due to significant speed up efforts: higher + more consistent limits within segment, grade/terrain separation)

otherwise: $c = 0.5$ (real world examples: service max speeds vs. average speeds)

find

L = segment length (mi)

f = efficiency: average speed as a factor of v

μ = segment avg spd (mph) = $f * v$

t = segment time = L / μ

line stats

T = E2E time

