Acceleration limited Velocity Curve for Path Following

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1 About

This article defines and showcases an 'acceleration' limited velocity curve formulation of a vehicle approaching a path.

First, we define a nomenclature in Figure 1 and below.

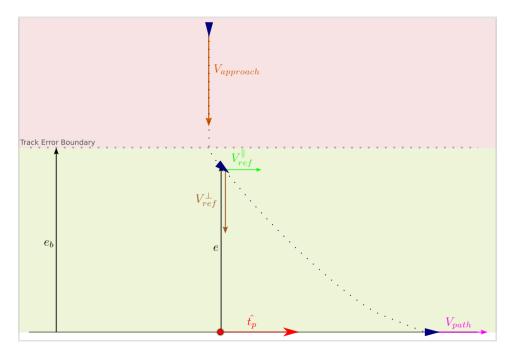


Figure 1: Typical path following scenario nomenclature

2 Defining orthogonal velocity curve

The 'orthogonal' velocity is what actually ties the 'time' - 'track error' relationship (e(t)) since the cross track error is only affected by the orthogonal velocity. Theoretically, 'parallel' velocity can have an infinite number of plausible e(t) curves.

Let's take a close look at a typical orthogonal velocity curve in Figure 2.

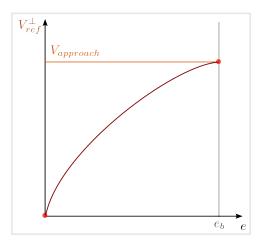


Figure 2: Orthogonal Velocity Curve

Here, we define $V_{ref}^{\perp}(e)$, which represents the relationship between orthogonal velocity and cross track error, as shown in Figure 2.

2.1 Constraints of V_{ref}^{\perp}

To satisfy the entry and on-path conditions, it is clear that the orthogonal velocity curve has a constraint of:

$$V_{ref}^{\perp}(e) = \begin{cases} V_{approach} & \text{if } e = e_b \\ 0 & \text{if } e = 0 \end{cases}$$
 (1)

Meaning that at the track error boundary, approaching velocity must be respected and on path orthogonal velocity must be 0 (to follow the path).

2.2 Acceleration limited orthogonal velocity profile

2.2.1 Derivations of orthogonal velocity curve

Here is a more in-depth constraint formulation using derivation:

$$\frac{d}{dt}V_{ref}^{\perp}(e) = \frac{de}{dt}\frac{d}{de}V_{ref}^{\perp}(e)$$

$$= -V_{ref}^{\perp}(e) * \frac{d}{de}V_{ref}^{\perp}(e)$$
(2)

Therefore, if
$$\frac{d}{dt}V_{ref}^{\perp}(e) \ge -a_{max}^{\perp}$$
,

$$\frac{d}{de}V_{ref}^{\perp}(e) \le \frac{a_{max}^{\perp}}{V_{\perp_{ref}}}$$
(3)

This places an upper limit to the derivative of the $V^{\perp}_{ref}(e)$ curve.

2.2.2 Simple maximum acceleration orthogonal velocity curve

Using the constraint Equation 1, the 'maximum' acceleration (deceleration) profile of approaching the path can be defined like following:

With orthogonal acceleration limit:
$$a_{max}^{\perp}$$
 (4)

$$S_{max-acc}^{\perp} = \{ V_{ref}^{\perp}(e) | \ddot{e} = -a_{max}^{\perp} \}$$
 (5)

Where the $S_{max-acc}^{\perp}$ defines the most aggressive curve that is feasible (with a hard deceleration of $-a_{max}^{\perp}$ once the track error enters the track error boundary.

This curve is in fact easily deducible using a constant acceleration equation on a 1-dimensional axis:

With
$$e_b = \frac{V_{approach}^2}{2a_{max}^{\perp}}$$
 (6)

$$S_{max-acc}^{\perp}(e) = \begin{cases} \sqrt{2a_{max}^{\perp}} * \sqrt{e} & \text{if } e < e_b \\ V_{approach} & \text{if } e \ge e_b \end{cases}$$
 (7)

Particularly, we define the e_b in this case as $e_{approach}^{min}$, which defines the minimum required track error to bring $V_{approach}$ to 0 using maximum orthogonal acceleration.

$$e_{approach}^{min} = \frac{V_{approach}^2}{2a_{max}^\perp} \tag{8}$$

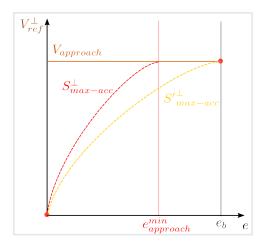


Figure 3: Maximum orthogonal acceleration curve

Note here that $e^{min}_{approach}$ varies by acceleration limit and approach speed. And if we have a constant e_b that we must satisfy (as drawn in Figure 3), it is simply physically impossible to brake in time without overshooting the path if e_b is smaller than $e^{min}_{approach}$. Therefore, another constraint applies:

$$e_b \ge e_{approach}^{min}$$
 (9)

And as long as the Equation 9 and Equation 3 satisfies, *any* curve can be a feasible curve that doesn't exceed maximum orthogonal acceleration limit.

2.2.3 Relaxed maximum acceleration orthogonal velocity curve

As noted in the previous section, as long as the Equation 9 satisfies, the velocity curve can be drawn. However, how do we actually accommodate the specified e_b into the velocity curve?

To provide a simple solution, a 'relaxed' orthogonal velocity curve $S'^{\perp}_{max-acc}$ can be formulated like following:

$$S'_{max-acc}^{\perp}(e) = S_{max-acc}^{\perp}(\frac{e_{approach}^{min}}{e_b} * e)$$

$$= \begin{cases} \sqrt{\frac{2a_{max}^{\perp}e_{approach}^{min}}{e_b}} * \sqrt{e} & \text{if } e < e_b \\ V_{approach} & \text{if } e \ge e_b \end{cases}$$

$$= \begin{cases} V_{approach} * \sqrt{\frac{e}{e_b}} & \text{if } e < e_b \\ V_{approach} & \text{if } e \ge e_b \end{cases}$$

$$= \begin{cases} V_{approach} * \sqrt{\frac{e}{e_b}} & \text{if } e < e_b \\ V_{approach} & \text{if } e \ge e_b \end{cases}$$

Which is basically a *stretched* form of $S_{max-acc}^{\perp}$ to match $e_{approach}^{min}$ to specified e_b . This satisfies the acceleration derivative constraint (Equation 3), because the derivative will always be below the upper limit when stretched across the track error axis. This is also illustrated in Figure 3.

Note that not every curve between $S_{max-acc}^{\perp}$ and $S_{max-acc}^{\prime}$ is a feasible curve. Because derivative can go over the upper limit in local sections. Introducing the relaxed maximum acceleration orthogonal velocity curve was in fact motivated by the fact that there are infinite solutions, to provide a simple feasible solution.

3 Parallel Velocity Curve

Now that we have a theoretical maximum acceleration constrained $V_{ref}^{\perp}(e)$ curve, the parallel Velocity curve can be defined.

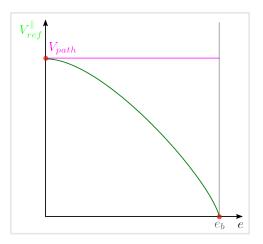


Figure 4: Parallel Velocity Curve

3.1 Constraints of $V_{ref}^{\parallel}(e)$

To respect the boundary/on-path conditions, it is clear that the parallel velocity curve has a constraint of:

$$V_{ref}^{\parallel}(e) = \begin{cases} 0 & \text{if } e = e_b \\ V_{path} & \text{if } e = 0 \end{cases}$$
 (11)

3.2 Acceleration limited parallel velocity profile

First constraint that applies to $V_{ref}^{\parallel}(e)$ is it's acceleration along the direction parallel to the path. This can be derived easily, but with a dependency to orthogonal velocity curve.

With parallel acceleration limit:
$$a_{max}^{\parallel}$$
 (12)

$$S_{max-acc}^{\parallel} = \{ V_{ref}^{\parallel}(e) | \ddot{V}_{ref}^{\parallel}(e) = a_{max}^{\parallel} \}$$
 (13)

If we apply the derivation:

$$\frac{d}{dt}V_{ref}^{\parallel}(e) = \frac{de}{dt}\frac{d}{de}V_{ref}^{\parallel}(e)$$

$$= -V_{ref}^{\perp}(e) * \frac{d}{de}V_{ref}^{\parallel}(e)$$
(14)

Therefore, if
$$\frac{d}{dt}V_{ref}^{\parallel}(e) \leq a_{max}^{\parallel}$$
,
$$\frac{d}{de}V_{ref}^{\parallel}(e) \geq -\frac{a_{max}^{\parallel}}{V_{\perp ref(e)}}$$
 (15)

This puts a lower bound on the derivative of $V_{ref}^{\parallel}(e)$, defining how aggressively the parallel velocity can decrease along cross-track error (e).

3.2.1 Maximum acceleration parallel velocity with relaxed max orthogonal velocity curve

It should be noted that by substituting the relaxed maximum acceleration orthogonal velocity curve (Equation 10) to $V_{ref}^{\perp}(e)$, the constraint becomes:

$$\frac{d}{de}V_{ref}^{\parallel}(e) \ge -\frac{a_{max}^{\parallel}}{S'_{max-acc}(e)}$$

$$= \begin{cases}
-\frac{a_{max}^{\parallel}}{V_{approach}} * \sqrt{\frac{e_b}{e}} & \text{if } e < e_b \\
-\frac{a_{max}^{\parallel}}{V_{approach}} & \text{if } e \ge e_b
\end{cases}$$
(16)

Also, considering boundary constraints in Equation 11, it should be noted that another constraint must be satisfied between V_{path} and e_b , since if the V_{path} is too large, it would be impossible to reach the desired speed on path with a given e_b distance to track. Therefore, we must compute the 'maximum' V_{path} achievable with a given constraints:

$$\begin{aligned} V_{path}^{max}|_{S_{max-acc}^{\prime\perp}} &= S_{max-acc}^{\parallel}(e=0) \\ &= \int_{e_b}^{0} -\frac{a_{max}^{\parallel}}{V_{approach}} \sqrt{\frac{e_b}{e}} de \\ &= -\frac{a_{max}^{\parallel} \sqrt{e_b}}{V_{approach}} * [2\sqrt{e}]_{e_b}^{0} \\ &= \frac{2a_{max}^{\parallel} e_b}{V_{approach}} \end{aligned}$$

$$(17)$$

Therefore, if V_{path} is greater than the calculated $V_{path}^{max}|_{S_{max-acc}^{\prime\perp}}$, the parallel velocity curve is simply infeasible with the parallel acceleration constraints. And it is in fact possible to calculate the minimum track error boundary required to achieve the speed on path:

Since
$$V_{path} = \int_{e_{path}}^{0} -\frac{a_{max}^{\parallel}}{V_{approach}} \sqrt{\frac{e_b}{e}} de$$
,
$$= -\frac{a_{max}^{\parallel} \sqrt{e_b}}{V_{approach}} * [2\sqrt{e}]_{e_{path}}^{0},$$
Therefore, $e_{path}^{min}|_{S_{max-acc}^{\prime\perp}} = [\frac{V_{path} V_{approach}}{2a_{max}^{\parallel}}]^2 * \frac{1}{e_b}$ (18)

Which defines the minimum track error point where acceleration in parallel velocity should be applied, with the given relaxed maximum acceleration orthogonal velocity curve $S'^{\perp}_{max-acc}$.

Using this, we can formulate the maximum acceleration parallel velocity curve dependent on relaxed orthogonal velocity:

$$S_{max-acc}^{\parallel}(e) = \begin{cases} V_{path} - \frac{2a_{max}^{\parallel}\sqrt{e_b}}{V_{approach}} * \sqrt{e} & \text{if } e < e_{path}^{min}|_{S_{max-acc}^{\prime\perp}} \\ 0 & \text{if } e \ge e_{path}^{min}|_{S_{max-acc}^{\prime\perp}} \end{cases}$$
(19)

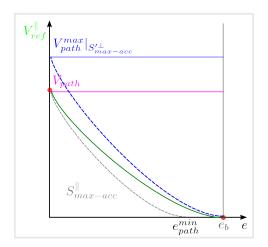


Figure 5: Acceleration limited parallel velocity curve

3.2.2 Relaxed parallel velocity curve with relaxed orthogonal velocity curve

Similarly to orthogonal velocity curve's case, the $e_{path}^{min}|_{S_{max-acc}^{\prime\perp}}$ doesn't equal to e_b all the time. Therefore, we introduce another relaxed parallel velocity curve that satisfies the acceleration limits:

$$S'^{\parallel}_{max-acc}(e) = S^{\parallel}_{max-acc} \left(\frac{e^{min}_{path}|_{S'^{\perp}_{max-acc}}}{e_{b}} * e \right)$$

$$= \begin{cases} V_{path} - \frac{2a^{\parallel}_{max}\sqrt{e_{b}}}{V_{approach}} * \sqrt{\frac{e^{min}_{path}|_{S'^{\perp}_{max-acc}}}{e_{b}}} * e & \text{if } e < e_{b} \\ 0 & \text{if } e \ge e_{b} \end{cases}$$

$$= \begin{cases} V_{path} * (1 - \sqrt{\frac{e}{e_{b}}}) & \text{if } e < e_{b} \\ 0 & \text{if } e \ge e_{b} \end{cases}$$

$$= \begin{cases} V_{path} * (1 - \sqrt{\frac{e}{e_{b}}}) & \text{if } e < e_{b} \\ 0 & \text{if } e \ge e_{b} \end{cases}$$

This is a very similar form to Equation 10, as the velocities get ramped in/out proportional to $\sqrt{\frac{e}{e_b}}$.

3.3 Velocity norm Monotonicity

Another constraint is to make sure vehicle doesn't brake and accelerate, but rather have a constantly decreasing velocity norm profile when approaching path. This is desired since it gives a smooth speed curve, which can have higher efficiency (to be clarified), and more intuitive path following behavior.

$$|\dot{V_{ref}}| \le 0 \tag{21}$$

Since derivative of the velocity curves against track error (e), when multiplied by $-V_{ref}^{\perp}$ gives the derivative against time, this can be formulated as:

$$\begin{aligned} |\dot{V_{ref}}| &= \sqrt{V_{ref}^{\parallel}^{2} + V_{ref}^{\perp}^{2}} \\ &= \frac{1}{|V_{ref}|} * (\dot{V}_{ref}^{\parallel} + \dot{V}_{ref}^{\perp}) \\ &= \frac{-V_{ref}^{\perp}}{|V_{ref}|} * (\frac{dV_{ref}^{\parallel}}{de} + \frac{dV_{ref}^{\perp}}{de}) \end{aligned}$$

$$(22)$$
Therefore,
$$\frac{dV_{ref}^{\parallel}}{de} + \frac{dV_{ref}^{\perp}}{de} \geq 0$$

3.3.1 Monotonicity constraint on relaxed curves

Using Equation 10 and Equation 20:

$$\frac{dV_{ref}^{\parallel}}{de} + \frac{dV_{ref}^{\perp}}{de} = \frac{V_{approach} - V_{path}}{\sqrt{e_b}} * \frac{1}{2\sqrt{e}} \ge 0$$
 (23)

This indicates that for our relaxed curves to satisfy monotonically reducing velocity form as it approaches the path, the approach velocity must be bigger than velocity on path.

4 Analysis

The nomenclature defined in previous sections can be used to evaluate various curves: