

Trajectory correction algorithms for a 3D underwater vehicle using affine transformations

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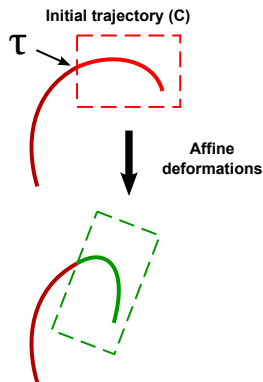
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 - ▶ **exact, algebraic, corrections**

Affine trajectory deformation

- ▶ A transformation $\mathcal{F}$ **deforms** a trajectory $\mathcal{C} = (x(t), y(t))_{t \in [0, \tau]}$ into $\mathcal{C}'$ at a time instant τ by

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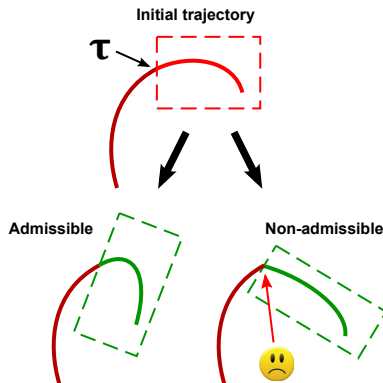


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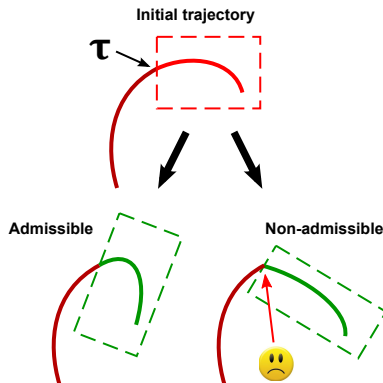


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- ▶ How to characterize the **set of admissible affine transformations**?



Admissible affine transformations for some systems

Surprisingly, the set of admissible affine transformations can be shown to be a **Lie subgroup** of the General Affine group (GA_2 or GA_3) of dimension...



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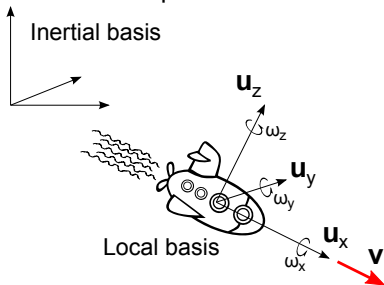
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Trajectory correction for a 3D underwater vehicle

Model description:



Kinematic equations:

$$\left\{ \begin{array}{lcl} \dot{v} & = & a \\ \begin{pmatrix} \dot{\phi} \\ \dot{\theta} \\ \dot{\psi} \end{pmatrix} & = & \mathbf{R}(\phi, \theta) \begin{pmatrix} \omega_x \\ \omega_y \\ \omega_z \end{pmatrix} \\ \dot{x} & = & v \cos \psi \cos \theta \\ \dot{y} & = & v \sin \psi \cos \theta \\ \dot{z} & = & -v \sin \theta \end{array} \right.$$

Position of the robot: (x, y, z)

Orientation of the robot: (ϕ, θ, ψ)

Trajectory correction for a 3D underwater vehicle (II)

Conditions for a trajectory to be admissible

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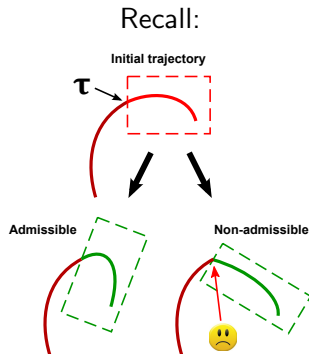
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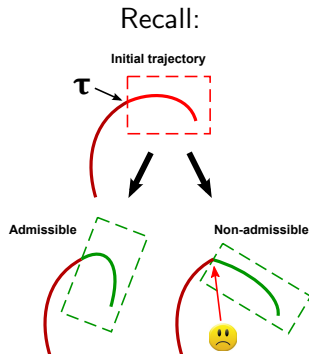
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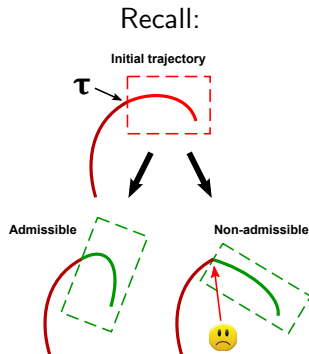
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where $C(t) = (x(t), y(t), z(t))$ and the matrix of $\mathbf{M}$ in some well-defined basis has **4 free coefficients** (out of 9)

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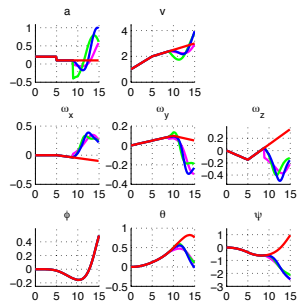
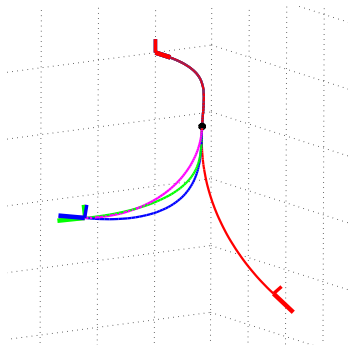
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- ▶ Note: after obtaining a deformed trajectory $C'(t)$ by the above formula, one can recover the commands $(a, \omega_x, \omega_y, \omega_z)$ by some differentiations and elementary operations

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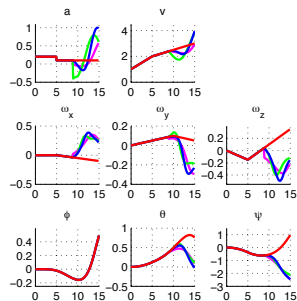
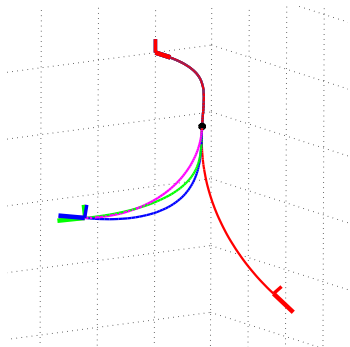
Three examples of final position corrections



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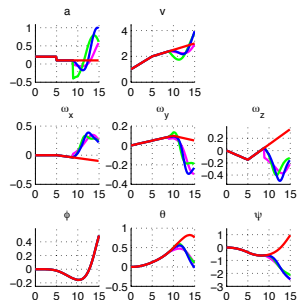
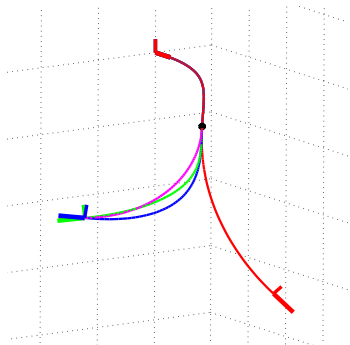
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- ▶ The green and blue corrections correct towards a same final position, but with **different final orientations** ("redundancy")

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 - ▶ How about using more general groups (e.g. projective)?