Blended Locally-Optimal Control Laws for Space Debris Removal in LEO using a Solar Sail

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Introduction

Mission Scenario

Dynamical Model

- Equations of motion
- Perturbing Accelerations
- Eclipses

Transfer Strategy

- 1st Phase: semimajor axis increase
- 2nd Phase: blended control law
- Descent Phase

4 Numerical Simulations

5 Conclusion

Table of Contents



Introduction

Mission Scenario

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- Descent Phase

Introduction - Space debris

Space Debris Problem

- Increasing number of objects
- Active removal strategies
- Constellations



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Space Debris Model Circular orbits Same inclination Different RAAN

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Introduction - Mission Scenario



Table of Contents

Introductio

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Dynamical Model

- Equations of motion
- Perturbing Accelerations
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4 Numerical Simulations

5 Conclusion

Equations of Motion

Modified Equinoctial Orbital Elements (MEOEs)

$$p = a (1 - e^{2})$$

$$f = e \cos (\Omega + \omega)$$

$$g = e \sin (\Omega + \omega)$$

$$h = \tan (i/2) \cos (\Omega)$$

$$k = \tan (i/2) \sin (\Omega)$$

$$L = \Omega + \omega + \nu$$

 $\mathbf{x} = [p, f, g, h, k, L]^{\mathrm{T}}$ sail state vector $\dot{\mathbf{x}} = \mathbb{A}(\mathbf{x}) \mathbf{a} + \mathbf{b}(\mathbf{x})$ equation of motion

 $a = a_{SRP} + a_D + a_L + a_{J_2}$ perturbing acceleration (in RTN frame)

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Equations of Motion

$$\mathbb{A}(\mathbf{x}) = \begin{bmatrix} 0 & \frac{2p}{q} \sqrt{\frac{p}{\mu}} & 0 \\ \sqrt{\frac{p}{\mu}} \sin L & \sqrt{\frac{p}{\mu}} \frac{1}{q} [(q+1)\cos L + f] & -\sqrt{\frac{p}{\mu}} \frac{g}{q} [h\sin L - k\cos L] \\ -\sqrt{\frac{p}{\mu}} \cos L & \sqrt{\frac{p}{\mu}} \frac{1}{q} [(q+1)\sin L + g] & \sqrt{\frac{p}{\mu}} \frac{f}{q} [h\sin L - k\cos L] \\ 0 & 0 & \sqrt{\frac{p}{\mu}} \frac{s^2 \cos L}{2q} \\ 0 & 0 & \sqrt{\frac{p}{\mu}} \frac{s^2 \sin L}{2q} \\ 0 & 0 & \sqrt{\frac{p}{\mu}} \frac{1}{q} [h\sin L - k\cos L] \end{bmatrix}$$
$$\mathbf{b}(\mathbf{x}) = \begin{bmatrix} 0 & 0 & 0 & 0 & \sqrt{\mu p} \left(\frac{q}{p}\right)^2 \end{bmatrix}^{\mathrm{T}}$$
$$q = 1 + f\cos L + g\sin L \qquad s^2 = 1 + h^2 + k^2$$

Solar Radiation Pressure Acceleration

Ideal Force Model

- Flat plate
- Only specular reflection

$$\boldsymbol{a}_{SRP} = \eta \, \boldsymbol{a}_c \, \cos^2 \alpha \, \boldsymbol{\hat{n}}$$

- η : shadow factor ($\eta = 0$ eclipse, $\eta = 1$ sunlight)
- a_c : characteristic acceleration
- $\alpha \in [0, \, \pi/2]$: cone angle

Assumption

The dependence of a_{SRP} on the distance from the Sun is neglected

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Solar Radiation Pressure Acceleration

Sunlight reference frame \mathcal{T}_S :



Atmospheric Drag and Lift

Atmospheric Model

- Hyperthermal free-molecular flow ($v_{S/C} \gg v_{thermal}$)
- NRLMSISE-00 model (MATLAB function atmosnrlmsise00)
- Flat plate

$$oldsymbol{a}_{\mathsf{D}} = -rac{1}{2} rac{
ho \, v^2}{\sigma} oldsymbol{C}_D \, oldsymbol{\hat{v}}$$
 $oldsymbol{a}_{\mathsf{L}} = rac{1}{2} rac{
ho \, v^2}{\sigma} oldsymbol{C}_L \, oldsymbol{\hat{L}}$

- *ρ*: atmospheric density (*atmosnrlmsise00*)
- σ : sail loading ($\sigma = m/A$)
- v: sail inertial velocity

Atmospheric Drag and Lift

Drag and Lift coefficients:

$$C_D = 2 \left[\sigma_T + \sigma_N V_R \left| \cos \zeta \right| + (2 - \sigma_N - \sigma_t) \cos^2 \zeta \right] \left| \cos \zeta \right|$$
$$C_L = 2 \left[\sigma_N V_R + (2 - \sigma_N - \sigma_T) \cos^2 \zeta \right] \left| \cos \zeta \right| \sin \zeta$$

 σ_N, σ_T : normal and tangential accommodation coefficients (≈ 0.8) V_R : ratio of the average thermal speed to the sail velocity (≈ 0.05) $\zeta \in [0, \pi]$: angle between $\hat{\boldsymbol{n}}$ and $\hat{\boldsymbol{v}}$



Earth's oblateness

$$[\mathbf{a}_{J_2}]_{\mathsf{R}} = -\frac{3 \,\mu \,J_2 \,R_{\oplus}^2}{2r^4} \left[1 - \frac{12 \,(h \sin L - k \cos L)^2}{(1 + h^2 + k^2)^2} \right]$$
$$[\mathbf{a}_{J_2}]_{\mathsf{T}} = -\frac{12 \,\mu \,J_2 \,R_{\oplus}^2}{r^4} \left[\frac{(h \sin L - k \cos L) \,(h \cos L + k \sin L)}{(1 + h^2 + k^2)^2} \right]$$
$$[\mathbf{a}_{J_2}]_{\mathsf{N}} = -\frac{6 \,\mu \,J_2 \,R_{\oplus}^2}{r^4} \left[\frac{(1 - h^2 - k^2) \,(h \sin L - k \cos L)}{(1 + h^2 + k^2)^2} \right]$$
$$\mu = 3.986 \times 10^5 \,\mathrm{km}^3/\mathrm{s}^2 \quad \text{Earth's gravitational parameter}$$
$$R_{\oplus} = 6378.14 \,\mathrm{km} \quad \text{Earth's mean equatorial radius}$$
$$J_2 = 1.0826 \times 10^{-3} \quad \text{Earth's second harmonic coefficient}$$
$$r = \text{orbital radius of the sail}$$

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Eclipses

Eclipse Model

• Cylindrical model

• Shadow factor
$$\eta = \begin{cases} 0 & \text{if } \theta_{\odot} + \theta_{\mathsf{sail}} < \theta \rightarrow & \mathsf{Eclipse} \\ 1 & \text{if } \theta_{\odot} + \theta_{\mathsf{sail}} \ge \theta \rightarrow & \mathsf{Sunlight} \end{cases}$$



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Table of Contents

Introductio

Mission Scenario

2 Dynamical Model

- Equations of motion
- Perturbing Accelerations
- Eclipses

3 Transfer Strategy

- 1st Phase: semimajor axis increase
- 2nd Phase: blended control law
- Descent Phase

4 Numerical Simulations

5 Conclusion

Transfer Strategy



1st Phase - Description

Objective

Find **optimal sail attitude** $\{\alpha_{opt}, \delta_{opt}\}$ that **minimizes** the **cost index** J at each time (MATLAB *fmincon*)

Cost Index

$$J = -\frac{da}{dt} = -2\sqrt{\frac{a^3}{\mu\left(1-e^2\right)}} \left[e\sin\nu\,a_R + \left(1+e\cos\nu\right)a_T\right]$$

Stopping Criterion

The $1^{\mbox{\scriptsize st}}$ phase ends when the $\mbox{perigee}$ altitude of the osculating orbit reaches $1000\mbox{ km}$

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13/29

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1st Phase - Optimization Procedure



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2nd Phase - Blended Control Law

Objective

Find **optimal sail attitude** $\{\alpha_{opt}, \delta_{opt}\}$ that **minimizes** the **cost index** J at each time (MATLAB *fmincon*)

Cost Index

$$J = W_a R_a \frac{d(a/a_0)}{dt} + W_e R_e \frac{de}{dt} + W_i R_i \frac{di}{dt}$$

 $W_e, W_e, W_i \in [0, 1]$: constant weights R_a, R_e, R_i : variable weights

$$\frac{de}{dt} = \sqrt{\frac{a\left(1-e^2\right)}{\mu}} \left[\sin\nu a_R + \left(\cos\nu + \frac{e+\cos\nu}{1+e\cos\nu}\right)a_T\right]$$
$$\frac{di}{dt} = \sqrt{\frac{a\left(1-e^2\right)}{\mu}} \frac{\cos\left(\omega+\nu\right)}{1+e\cos\nu} a_N$$

2nd Phase - Blended Control Law

Variable Weights

- Adjust the **relative importance** of each orbital element according to the "distance" from the target
- The **sign** indicates if the o.e. time derivative has to be **maximized** (*R* < 0) or **minimized** (*R* > 0)

$$R_a = rac{a - a_t}{|a_0 - a_t|}, \quad R_e = rac{e - e_t}{|e_0 - e_t|}, \quad R_i = rac{i - i_t}{|i_0 - i_t|}$$

where

 $\{a_t, e_t, i_t\}$ are the **target semimajor axis**, **eccentricity** and **inclination** $\{a, e, i\}$ are the **sail instantaneous** orbital elements $\{a_0, e_0, i_0\}$ are the **sail** orbital elements at the **end of the 1**st **phase Example 1** (SSS 2023, New York City, USA)

2nd Phase - RAAN Matching

J2 Perturbation

- a, e, i undergo short-term oscillations
- Ω has a **secular drift** ($\dot{\Omega} < 0$ for prograde orbits)

Assumption

RAAN behaviour depends only on J_2 (contribution of SRP is negligible)

RAAN of target **debris**: $\Omega_t(t) = \Omega_{t,0} + \dot{\Omega}_t t$

RAAN of solar sail: $\Omega(t) = \Omega_0 + \dot{\Omega}_{avg} t$

$$\begin{split} \dot{\Omega}_{avg} &= -\frac{3}{2} \frac{J_2 \sqrt{\mu} R_{\oplus}^2}{a_{avg}^{7/2} (1 - e_{avg}^2)^2} \cos i_{avg} \\ a_{avg} &= (a_0 + a_t)/2 \qquad e_{avg} = (e_0 + e_t)/2 \qquad i_{avg} = (i_0 + i_t)/2 \end{split}$$

2nd Phase - RAAN Matching

Estimated flight time Δt s.t. $\Omega_t(\Delta t) = \Omega(\Delta t)$



2nd Phase - Genetic Algorithm

Objective

Find the 3 optimal constant weights $W_{a,e,i}$ that minimize the objective function F

GA Objective Function

$$F = \left(\frac{a_{fin} - a_t}{a_0}\right)^2 + (e_{fin} - e_t)^2 + (i_{fin} - i_t)^2 + (\Omega_{fin} - \Omega_t)^2$$

 $a_{\rm fin},\,e_{\rm fin},\,i_{\rm fin},\,\Omega_{\rm fin}:$ sail orbital elements at the end of propagation time Δt

Approximate Model

An **approximate model** for the transfer is necessary to **reduce the computational time** of the GA

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2nd Phase - Approximate Model



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Descent Phase - Description

Assumptions

- Flight time is not constrained
- RAAN matching is not necessary
- Sail loading $\sigma_{desc} = 2\sigma$ due to debris mass

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$$\sigma_{desc} = 2\sigma \implies a_{c, desc} = a_c/2$$

Initial Orbit (= Debris Orbit)
$a_0=a_t=R_\oplus+1200\mathrm{km}$
$e_0 = e_t = 0$
$i_0 = i_t$



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Descent Phase: blended control law

Objective

Find **optimal sail attitude** $\{\alpha_{opt}, \delta_{opt}\}$ that **minimizes** the **cost index** J at each time (MATLAB *fmincon*)

Cost Index

$$J = R_a \, \frac{d(a/a_0)}{dt} + R_e \, \frac{de}{dt} + R_i \, \frac{di}{dt}$$

$$R_a = \frac{a - a_{\text{fin}}}{|a_0 - a_{\text{fin}}|}, \quad R_e = e - e_{\text{fin}}, \quad R_i = i - i_{\text{fin}}$$

Weights

Necessary to redefine R_e and R_i since $e_0 = e_{fin} = 0$ and $i_0 = i_{fin}$

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5th-9th June 2023

Table of Contents

Introductio

Mission Scenario

Dynamical Model

- Equations of motion
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Numerical Simulations

Conclusion

Numerical Simulations - 1st Phase - Data

Start Date: 01/01/2030

Characteristic Acceleration: $a_c = 0.1 \text{ mm/s}^2$

Stopping Criterion: $h_P = 1000 \text{ km}$

Sail parking orbit	
$h_0 = 600 \mathrm{km}$	
$e_0 = 0$	
$i_0 = 60 \deg$	
$\Omega_0=0\text{deg}$	

Target debris orbit $h_t = 1200 \, \mathrm{km}$ $e_t = 0$ $i_t = 60 \, \mathrm{deg}$ $\Omega_t = \Omega_{t,0} + \dot{\Omega}_t t$

Numerical Simulations

1st Phase - SMA increase - Plots



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5th-9th June 2023

24 / 29

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2nd Phase - Debris targeting - Results

Genetic Algorithm Settings	GA Results
Population Size $= 50$	$W_a = 0.27849822$
Elite Count $= 2$	$W_e = 0.83082863$
Number of Generations $= 10$	$W_i = 0.76324954$
Function Tolerance $= 1 imes 10^{-6}$	$F_{ m opt}=1.0907 imes10^{-6}$
$\Delta\Omega_0=10{ m deg}$	Flight Time $= 101.9 \text{days}$

Orbit	<i>a</i> [km]	е	i [deg]	Ω [deg]
Sail initial	7433.5	0.0074	59.87	56.98
Debris initial	7578.1	0	60	46.98
Debris final				130.07
Sail final Approx	7588.7	0.0009	59.99	130.05
Sail final Exact	7574.4	0.0017	60	127.23

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Numerical Simulations

2nd Phase - Debris targeting - Plots



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Descent Phase - Plots



Table of Contents

Introductio

Mission Scenario

Dynamical Model

- Equations of motion
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- 1st Phase: semimajor axis increase
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Numerical Simulations

Conclusion

Conclusion

Conclusions

- Locally-optimal laws work well in perturbed environments
- Blending seems effective in controlling more orbital parameters at the same time
- Approximate model is pretty accurate for a preliminary study

Model Improvements

- Way to estimate the RAAN at the end of the 1st phase
- Increase number of generations in the Genetic Algorithm

Further Developments

Further Developments

- Switching point between 1st and 2nd phase to be optimized
- Higher performance sails to reduce parking orbit's height
 - \rightarrow shorter re-entry time for debris
- Multiple debris removal strategy
 - \rightarrow best use of solar sails as propellantless devices
 - \rightarrow reduction of launch cost

Thank you for your attention!

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