Wind tolerant controller and robust INS/GPS sensor fusion architecture for multirotor UAV

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Motivation 0000	Quadrotor Dynamics	Control law 000000	Sensor Faults	Results
Outlines				



Quadrotor Dynamics

3 Control law







UAVs Reliability





Failure rate on a conventional aircraft

 S. Reimann, J. Amos, E. Bergquist, J. Cole, J. Phillips, S. Shuster, UAV for Reliability, AEM 4331 -Aerospace Vehicle Design, December 2013.

Motivation ○●○○	Quadrotor Dynamics	Control law	Sensor Faults	Results
Problem f	ormulation			

Wind pertubations on system



- Additional uncertainties
- Induced disturbance forces and moments
- Loss of stability

Motivation ○○●○	Quadrotor Dynamics	Control law	Sensor Faults	Results
Problem	formulation			

Onboard sensors vulnerable to hardware faults





IMU



Barometer



Compass

Motivation ○○○●	Quadrotor Dynamics	Control law	Sensor Faults	Results
Aim of	Our Work			

- Maintaining system performance and stability in the presence of model uncertainties and external perturbations.
- Developing a strategy to cope with sensor faults.

Main Contributions

- Proposition of a nonlinear observer based on super-twisting theory to estimate the wind forces.
- Proposition of new EKF based GPS/INS fusion architecture to detect and isolate faulty sensors and software issues.

Motivation 0000	Quadrotor Dynamics ●○○	Control law	Sensor Faults	Results
Platform				

Quadrotor S500 frame



System's Parameters

Mass m Inertia I_{xx},I_{yy} Inertia I_{zz} Thrust factor K_f Length of the arm / Rotor's Inertia J_r

1.1 kg $2.2 * 10^{-2} Kg.m^{2}$ $5.5 * 10^{-2} Kg.m^{2}$ $2.75 * 10^{-5} Ns^2 / rad^2$ Drag factor K_t 3.6 * 10⁻⁷ Nm/rad² 0.22 m negligible

The thrust and torgue coefficients are provided by the manufacturer (www.dji.com).

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State variables and Control inputs



 $O_b: \{O_B, X_B, Y_B, Z_B\} \qquad \text{Bo}$ $O_E: \{O_E, X_E, Y_E, Z_E\} \qquad \text{Eat}$

Body-fixed frame Earth-fixed frame

State Variables

nosition	хv	
	х,у	
altitude	Z	
roll	ϕ	
pitch	θ	
yaw	ψ	
roll velocity	р	
pitch velocity	q	
yaw velocity	r	
Virtual control i	nputs	
Total thrust		u _t
roll torque		$ au_{\phi}$
pitch torque		$ au_ heta$
yaw torque		$ au_\psi$
Real inputs		
motors speeds	(.).	$i = 1$ Λ
motors speeds	ω_i	i = 1,4

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NonLinear Model

The Quadrotor's dynamics are written as [5]:

$$\begin{cases} \ddot{x} = (\cos\phi\sin\theta\cos\psi + \sin\phi\sin\psi) * \frac{u_t}{m} \\ \ddot{y} = (\cos\phi\sin\theta\sin\psi - \sin\phi\cos\psi) * \frac{u_t}{m} \\ \ddot{z} = (\cos\phi\cos\theta)\frac{u_t}{m} - g \\ \ddot{\phi} = \frac{l_{yy} - l_{zz}}{l_{xx}}\dot{\theta}\dot{\psi} - \frac{J_r}{l_{xy}}\dot{\theta}\Omega + \frac{1}{l_{xx}}\tau_{\phi} \\ \ddot{\theta} = \frac{l_{zz} - l_{xx}}{l_{yy}}\dot{\phi}\dot{\psi} - \frac{J_r}{l_{yy}}\dot{\phi}\Omega + \frac{1}{l_{yy}}\tau_{\theta} \\ \ddot{\psi} = \frac{l_{xz} - l_{yy}}{l_{zz}}\dot{\phi}\dot{\theta} + \frac{1}{l_{zz}}\tau_{\psi} \end{cases}$$
(1)

The relation between the virtual inputs and the motors speeds:

$$\begin{cases} u_{t} = F_{1} + F_{2} + F_{3} + F_{4} \\ \tau_{\phi} = (F_{4} - F_{2}) * I \\ \tau_{\theta} = (F_{3} - F_{1}) * I \\ \tau_{\psi} = (\tau_{1} + \tau_{3}) - (\tau_{2} + \tau_{4}) \end{cases}$$
(2)

[5] S. Bouabdallah, "Design and Control of Quadrotors With Application to Autonomous Flying," Ph.D thesis, Ecole Polytechnique Federale de Lausanne, 2007.

Motivation	Quadrotor Dynamics	Control law ●○○○○○	Sensor Faults	Results
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Generalities

nonlinear system general form

$$x^{(n)} = f(x, \dot{x}, \ddot{x}, ..., x^{(n-1)}, t) + g(x, \dot{x}, \ddot{x}, ..., x^{(n-1)}, t)u + w(t)$$
(3)

- $x^{(n)}$: state vector
- *u* : virtual input vector

- f : modeled dynamics function
- g : control function
- w(t) : unmodeled dynamics

Uncertain functions Boundaries

$$\begin{aligned} |f(\underline{x},t) - \hat{f}(\underline{x},t)| &\leq F(\underline{x},t) \\ |g(\underline{x},t) - \hat{g}(\underline{x},t)| &\leq G(\underline{x},t) \\ w(\underline{x},t) - \hat{w}(\underline{x},t)| &\leq W(\underline{x},t) \\ |\dot{w}(\underline{x},t) - \dot{w}(\underline{x},t)| &\leq \delta(\underline{x},t) \end{aligned}$$
(4)

Motivation	Quadrotor Dynamics	Control law ○●○○○○	Sensor Faults	Results
Sliding	variable			

• Defining the tracking error as :

$$\tilde{x} = x - x_d \tag{5}$$

• Introducing sliding variable :

$$s = \dot{\tilde{x}} + \lambda \tilde{x} \tag{6}$$

Sliding variable properties

$$s\begin{cases} \dot{s} \ contains \ u\\ s \longmapsto 0 \ when \ t \longmapsto +\infty \Rightarrow \tilde{x} \longmapsto 0 \end{cases} (7)$$

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Lyapunov function

• Positive definite Lyapunov function :

$$V(t) = \frac{1}{2}s^2 \tag{8}$$

• Control law :

$$u = \frac{1}{\hat{g}}(\hat{u} - k * sign(s))$$

$$\hat{u} = -\hat{f} + \ddot{x}_d + \lambda \tilde{\dot{x}}$$
(9)

Lyapunov condition

$$\dot{V}(t) = s\dot{s} = s(f - \hat{f}) + w(t)s - k|s| \le -\eta|s| < 0$$
 (10)

• To ensure this condition:

Gain
$$k = F + W + \eta$$
(11)



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Solutions				

• Chattering

Super-twisting algorithm

$$u(t) = u_1 + u_2 \begin{cases} u_1 = -\alpha_1 |s|^{\tau} \operatorname{sign}(s), & \tau \in]0, \ 0.5] \\ \dot{u}_2 = -\alpha_2 \operatorname{sign}(s) \end{cases}$$
(12)

• Over/under-estimation of F :

$$\begin{aligned} & \textbf{Observer-based controller} \\ & \hat{u} = -\hat{f} - \hat{f}_{wind} + \ddot{x}_d + \lambda \ddot{\dot{x}} \end{aligned} \tag{13} \\ & \dot{V}(t) = s\dot{s} = s(f - \hat{f}) + s(f_{wind} - \hat{f}_{wind}) + w(t) - k|s| \le -\eta|s| \tag{14} \end{aligned}$$

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Wind est	timation			

$$\begin{cases} \dot{z}_{0} = v_{0} + \frac{u_{t}}{m}u_{x} - K_{p}(\dot{x} - \dot{x}_{d}) \\ v_{0} = -\alpha_{0x}|z_{0} - \sigma|^{2/3}sgn(z_{0} - \sigma) + z_{1} \\ \dot{z}_{1} = v_{1}, \ v_{1} = -\alpha_{1x}|z_{1} - v_{0}|^{1/2}sgn(z_{1} - v_{0}) + z_{2} \\ \dot{z}_{2} = -\alpha_{2x}sgn(z_{2} - v_{1}) \\ \dot{F}_{x} = z_{1} \end{cases}$$
(15)

 J. Davila, L. Fridman, and A. Levant," Second-order sliding-mode observer for mechanical systems," IEEE Transactions on Automatic Control, vol. 50, no. 11, Novembre 2005.

[2] Y. B. Shtessel, I. A. Shkolnikov, and A. Levant, "Smooth second-order sliding modes: Missile guidance application," Automatica, vol. 43, no.8, 2007.

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Multi-sensor data fusion architecture

Arducopter EK2



Riseborough, Paul. "Application of data fusion to aerial robotics." Proc. of Embedded Linux Conference. 2015.

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Multi-sensor data fusion architecture

Proposed architecture





Simulation - Adaptive Vs observer-based controller

Small wind forces < 1 N



S. Rajappa, C. Masone, and P. Stegagno, "Adaptive super twisting controller for a quadrotor uav," IEEE International Conference on Robotics and Automation (ICRA), pp. 2971–2977,2016.



Simulation - Adaptive Vs observer-based controller

Wind forces \backsim 5-6 N



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Experiment - PID Vs observer-based controller



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Simulation - Data fusion architecture



Motivation 0000	Quadrotor Dynamics	Control law	Sensor Faults	Results ○○○○●○
Video				

Real flight Test of Observer-based STA Controller Robust to Wind Perturbation for Multirotor UAV



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Thank You

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