

WIND LINE PROFILE USING MONTE CARLO RADIATION TRANSFER

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Radiative (Magneto) Hydrodynamic seminar
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Basic properties

- **HOT STARS** - spectral types O, B and A; $T_{\text{eff}} > 10000 \text{ K}$
- **STELLAR WIND** - escape of particles from star (strongest winds from massive luminous hot stars)
- **MASS LOSS RATE** and **TERMINAL VELOCITY** - for hot-stars \dot{M} up to $10^{-6} M_{\odot} \text{ year}^{-1}$ and V_{∞} up to $\approx 3000 \text{ km s}^{-1}$

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Hot-star winds play important role in:

- evolution of massive stars
- energy and momentum input into interstellar medium (ISM)
- enrichment of ISM with heavier elements (metals)

Basic properties

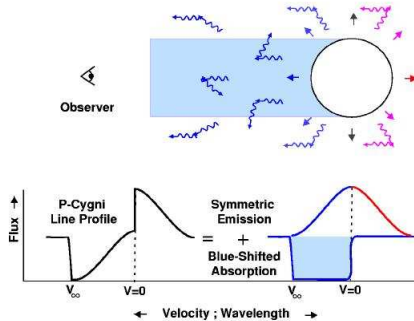
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- **P CYGNI PROFILE** - profile of line which is created in differentially expanding medium

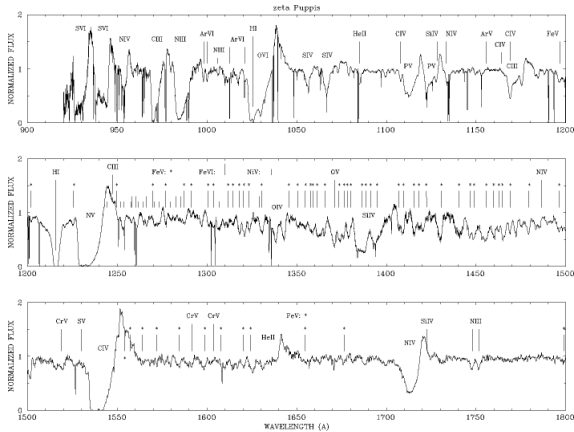
P-Cygni profile

Formation of a P-Cygni Line- Profile



by Stan Owocki

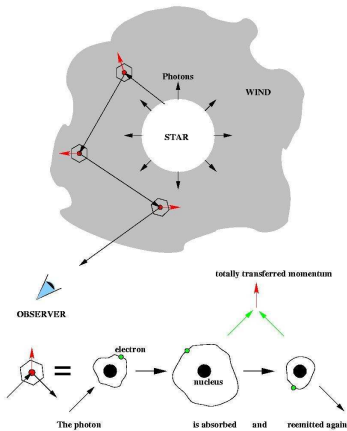
Wind lines of ζ Puppis (Pauldrach et al., 1994)



Merged spectrum of Copernicus and IUE UV high-resolution observations of the O4I(f) supergiant ζ Puppis
 (900-1500: Morton & Underhill 1977; 1500-1800: Walborn et al. 1985)

Basic properties

The principle of radiatively driven winds



- LINE RADIATION DRIVEN WIND - (Lucy & Solomon, 1970)

Clumping in hot-star winds

- **CLUMPS** - regions with different density than the surrounding wind matter)
 - Discrete Absorption Components (DAC) - from observations (e.g. Prinja & Howarth 1986)
 - Line Profiles Variations (LPVs) - evidence of clumps (e.g. Lépine & Moffat 1999; Lépine et al. 1999)
- Stability analysis of stellar winds (Lucy & Solomon 1970; MacGregor et al. 1979; Abbott 1980; Carlberg 1980; Owocki & Rybicki 1984; Owocki & Puls 2002, Krtićka & Kubát 2002, and other papers).
- Hydrodynamical simulations (Owocki et al. 1988; Feldmeier 1995, 2003; Dessart & Owocki 2003, 2005; Votruba et al. 2007, and other papers)

How do clumps create?

Small **perturbation of driving force** tends to grow and steepens into shocks -
SHOCK COMPRESSION

Motivation

- Modeling expanding atmosphere is a difficult task
- Stellar winds are usually described in spherical symmetry
- In moving atmosphere due to Doppler shift, opacity and emissivity are not isotropic
- We are able to model 1D smooth wind
- Solve **GENERAL RADIATION TRANSFER EQUATION IN 3D** for non-smooth wind (**INCLUDE CLUMPS**)

$$\frac{1}{c} \frac{\partial I}{\partial t} + \vec{n} \cdot \nabla I = \eta - \chi I$$

Wind model

Toy model

- **Density $\rho(r)$, temperature $T(r)$ and velocity $v(r)$ structure** from the model of the star with $R = 9.9 R_{\odot}$, $M = 32 M_{\odot}$, $L = 1.74 \cdot 10^5 L_{\odot}$ ($T_{\text{eff}} = 37500 \text{ K}$), $\dot{M} = 2.8 \cdot 10^{-7} M_{\odot}/\text{yr}$ and $v_{\infty} = 3270 \text{ km s}^{-1}$ (Krtićka et al., 2009; Krtićka & Kubát, 2004)
- **Flux at lower boundary** of the wind - static spherically symmetric NLTE model atmosphere code of Kubát (2003)

Our adopted wind model consists:

- 90 depth points (89 zones), similarly to Lucy & Abbott (1993)
- Density $\rho(r)$ is taken to be **constant within a zone** and equal to the value at the lower radius of the zone
- Radial velocity $v(r)$ is **linearly interpolated inside the zone**

Wind model

Assumptions

- All electrons in the wind come from **HYDROGEN** ionization
- The opacity of the medium consists of only two processes, **LINE SCATTERING** under Sobolev approximation, and the **ELECTRON SCATTERING**
- Ionization and excitation – **LTE**

Monte Carlo Radiation Transfer (MCRT)

- **MONTE CARLO METHOD** - quantity $\varepsilon \in [\varepsilon_1, \varepsilon_2]$ can be sampled from a probability distribution function (**PDF**) P_ε using uniformly distributed **RANDOM NUMBERS** R in the interval $(0; 1)$

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Advantage

- Quite simple compared to other radiative transfer techniques
- Relatively easy to develop and less likely to suffer from numerical problems (Auer 2003)
- Easy to extend to multi-dimensional problems
- Easy to parallelize (photons can propagate independently of each other)

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Disadvantage

- Enormous need of computational power to obtain results with sufficient signal-to-noise ratio
- Requires a large number of photons to be tracked

Monte Carlo Radiation Transfer (MCRT)

- 1 **The Cumulative Distribution Method** – if an analytical solution of $P(x)$ for x_0 is possible

$$\xi = \int_a^{x_0} P(x) dx = \psi(x_0)$$

$$P(x) \leq 1; \quad \int_a^b P(x) dx = 1$$

x_0 – parameter we wish to obtain

ξ – random number sampled uniformly from range 0 to 1

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- 2 **The Accept/Reject Method** – works for any PDF if we know the maximum value
- Pick x_1 in range $[a, b]$: $x_1 = a + \xi_x(b - a)$, calculate $P(x_1)$
 - Pick y_1 in range $[0, P_{max}]$: $y_1 = \xi_y P_{max}$
 - If $y_1 > P(x_1)$, reject x_1 ; if $y_1 < P(x_1)$, accept x_1

Random number generator (RNG)

- Computational RNGs produce sequences of **PSEUDO RANDOM NUMBERS (PRN)**, (Press et al., 1992)
- PRNs are determined by the **NUMERICAL ALGORITHM** in use and an **INITIAL SEED**
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- In our Monte Carlo scheme we used a **UNIFORM RNG** (Pang 1977)
- Multiplicative congruential algorithm (Lehmer 1951)

$$x_{i+1} = (ax_i + c) \pmod{m}; \quad m = 2^{31} - 1; \quad a = 7^5; \quad c = 0$$

Minimal Standard generator (Park & Miller 1988)

x_i – sequence of pseudo random values

$m > 0$ – the "modulus" (the sequence repeats itself after $m - 1$ values)

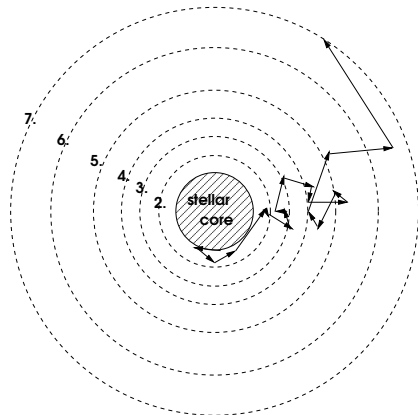
$0 < a < m$ – the "multiplier"

$0 \leq c < m$ – the "increment"

$0 \leq x_0 < m$ – the "seed" or "start value"

MCRT scheme

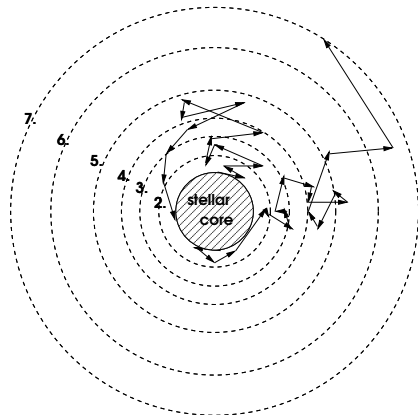
- The basic concept of a MCRT code is to **TRACK PHOTONS**
- Photon path and its interaction are simulated by sampling randomly from PDF
- Emit photon (pick random starting **frequency** and **direction**)
- Photon travels some distance (pick random **optical depth**)
- Something happens ... electron scattering or line scattering ... (pick random **isotropic direction**)
- If photon exit the medium, capture it



Photon path inside wind

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Photon path inside wind

Creation of photon

- Photons are sent from the stellar surface ($R_* = 1$) outwards
- Frequency of newly created photons is determined using the emergent flux distribution from the static hydrogen-helium photosphere (Kubát, 2003), with a help of the accept/reject method
- The direction of the photon is randomly chosen (**FLUX** in any direction of emission is **ISOTROPIC**)

$$F_\nu = \int I_\nu \cos \theta d\Omega; \quad \xi = 2 \int_0^\mu \mu' d\mu'; \quad \xi = \frac{1}{2\pi} \int_0^\phi d\phi \Rightarrow$$

$$\mu = \cos \theta = \sqrt{\xi}; \quad \phi = 2\pi\xi$$

- Initial photon direction

$$s_x = \sin \theta \cos \phi; \quad s_y = \sin \theta \sin \phi; \quad s_z = \cos \theta$$

Optical depth calculation

- The optical depth is randomly chosen

$$P(\tau) = e^{-\tau}; \quad \xi = \int_0^{\tau\xi} e^{-\tau} d\tau = 1 - e^{-\tau\xi} \Rightarrow$$

$$\tau_\xi = -\log \xi$$

- The actual optical depth is calculated by summing opacity contribution along photon path

$$\tau = \int_0^L \chi ds$$

- New photon's position is then updated according to

$$x = x + L \sin \theta \cos \phi; \quad y = y + L \sin \theta \sin \phi$$

$$z = z + L \cos \theta$$

Optical depth calculation

- **SCATTERING ON FREE ELECTRONS** – this process acts on all photons with any frequency in the same way ($\chi_e = n_e \sigma_e$)
- **RESONANCE LINE SCATTERING** – this process needs that the frequency of a photon meets a Doppler shifted frequency of a line of a scattering atom
- The condition that the line scattering may happen is

$$\nu_{\text{line}} = \nu_{\text{obs}} \left(1 - \frac{\vec{s} \cdot \vec{v}(r)}{c} \right)$$

- The optical depth of the electron scattering τ_{elsc} is calculated as

$$\tau_{\text{elsc}} = \int_0^{L'} n_e(r) \sigma_e ds; \quad \sigma_e = 6.6516 \cdot 10^{-25} \text{ cm}^2$$

Electron number density calculation

- Electron number density from given density ρ

$$\rho = n_e m_e + N \bar{m}; \quad n_e = N \sum_a \alpha_a \sum_{j=0}^{J_a} j f_{j,a}; \quad n_e = n_e^0 + \delta n_e$$

$$f_{j,a} = \frac{N_{j,a}}{N_a} - \text{ionization fraction}$$

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- Saha distribution (ionization state of a gas in LTE)

$$\left[\frac{N_{j,a}}{N_{j+1,a}} \right]_{LTE} = 2n_e \left(\frac{h^2}{2\pi m_e kT} \right)^{3/2} \frac{U_{j,a}(T)}{U_{j+1,a}(T)} e^{-(E_{j,a} - E_{j+1,a})/kT}$$

Partition function

$$U_{j,a}(T) = \sum_i g_{i,j,a} e^{-E_{i,j,a}/kT}$$

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Partition function

$$U_{j,a}(T) = \sum_i g_{i,j,a} e^{-E_{i,j,a}/kT}$$

- The Boltzmann excitation distribution (excitation state of a gas in LTE)

$$\left[\frac{n_{i,j,a}}{n_{l,j,a}} \right]_{LTE} = \frac{g_{i,j,a}}{g_{l,j,a}} e^{-(E_{i,j,a} - E_{l,j,a})/kT}$$

Opacity calculation

- Optical depth for line scattering

$$\tau_{\text{line}} = \frac{\pi e^2}{m_e c} f_{\text{line}} n_{i,j,a} \frac{c}{\nu_0} \left[\mu^2 \frac{d\nu(r)}{dr} + (1 - \mu^2) \frac{\nu(r)}{r} \right]^{-1}$$

Sobolev approximation

$$\tau = \frac{\chi_0(r)c}{\nu_0} \frac{1}{|\vec{s} \cdot \nabla(\vec{v} \cdot \vec{s})|} = \frac{\chi_0(r)c}{\nu_0} \frac{1}{\left| \frac{d\nu_s}{ds} \right|}$$

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$$\chi = \frac{\pi e^2}{m_e c} f_{\text{line}} n_{i,j,a}; \quad \frac{n_{i,j,a}}{N_{j,a}} = g_{i,j,a} \frac{e^{-E_{i,j,a}/kT}}{U_{j,a}(T)}$$

Opacity calculation

- Optical depth for line scattering

$$\tau_{\text{line}} = \frac{\pi e^2}{m_e c} f_{\text{line}} n_{i,j,a} \frac{c}{\nu_0} \left[\mu^2 \frac{d\nu(r)}{dr} + (1 - \mu^2) \frac{\nu(r)}{r} \right]^{-1}$$

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- Total optical depth

$$\tau_{\text{line}} + \tau_{\text{elsc}} > \tau_{\xi},$$

(photon terminates its travel in the layer where this condition was first fulfilled)

Scattering events

- After a scattering (either line or electron) photon obtains new direction, chosen randomly for the case of **ISOTROPIC SCATTERING** (Wood et al., 2004)

$$d\Omega = \sin \theta \, d\theta \, d\phi; \Rightarrow \quad P(\theta) = \frac{1}{2} \sin \theta; \quad P(\phi) = \frac{1}{2\pi}$$

$$\xi = \int_0^\theta P(\theta) \, d\theta = \frac{1}{2} \int_0^\theta \sin \theta \, d\theta = \frac{1}{2}(\cos \theta - 1) \Rightarrow \theta = \cos^{-1}(2\xi - 1)$$

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- For the case of line scattering, photon obtains a Doppler shifted frequency (in the observer frame)

$$\nu_{\text{obs,new}} = \nu_{\text{line}} \left(1 - \frac{\vec{S}_{\text{new}} \cdot \vec{v}(r)}{c} \right)^{-1}$$

- New optical depth randomly is chosen again

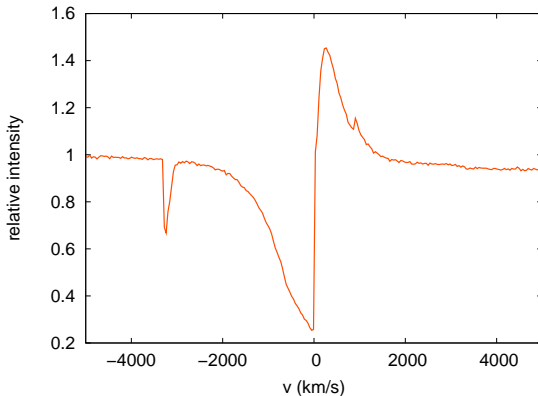
Binning

- Photon can escape from the wind region either back to the stellar surface or towards the observer
- We define a **frequency grid**, which determines frequency intervals - for **determining emergent flux**
- Each escaping photon is then counted according to its frequency to the proper frequency interval

Working line profile

The profile of the H α line

(the flux is expressed as relative intensity with respect to local continuum)



Further work

- Improve line profile
- Full line spectrum
- More continuum opacity sources (bound-free and free-free transitions)
- Extension to 3D to handle inhomogeneous (clumped) stellar wind
- NLTE effects

Radiative (Magneto) Hydrodynamic seminar

Ondřejov 28.01.2010

THANK YOU FOR YOUR ATTENTION!