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M. Podesta, M. Gorellenkova and R.B. White

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# Reduced fast ion transport model for the tokamak transport code TRANSP 

M. Podestà, M. Gorelenkova and R. B. White<br>Princeton Plasma Physics Laboratory, Princeton NJ 08543-USA

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#### Abstract

Fast ion transport models presently implemented in the tokamak transport code TRANSP [R. J. Hawryluk, in Physics of Plasmas Close to Thermonuclear Conditions, CEC Brussels, 1, 19 (1980)] are not capturing important aspects of the physics associated with resonant transport caused by instabilities such as Toroidal Alfvén Eigenmodes (TAEs). This work describes the implementation of a fast ion transport model consistent with the basic mechanisms of resonant mode-particle interaction. The model is formulated in terms of a probability distribution function for the particle's steps in phase space, which is consistent with the MonteCarlo approach used in TRANSP. The proposed model is based on the analysis of fast ion response to TAE modes through the ORBIT code [R. B. White et al., Phys. Fluids 27, 2455 (1984)], but it can be generalized to higher frequency modes (e.g. Compressional and Global Alfvén Eigenmodes) and to other numerical codes or theories.


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## I. INTRODUCTION

Simulations of tokamak discharges have made considerable progress in the past few years. Because of the complexity of the problems that numerical codes aim to solve, two main lines of code development are emerging. On one hand, first-principles models target a representation of tokamak physics as close as possible to reality. This is supported by improvements in both experimental measurements and theory, which enable a deeper insight into plasma physics phenomena than was possible only a decade ago. Examples of first-principle models applied to the physics of energetic particles and associated plasma instabilities can be found in Refs. [1][2][3][4][5][6] and references therein. The generality of this approach comes at a cost. Simulations are expensive, both in terms of computing time and of required hardware resources. Use of first-principles codes is thus usually restricted to a limited number of conditions. On the other hand, reduced models are often utilized in combination with more general-purpose codes to tackle specific problems in a simplified form. Recent examples include simplified models to compute the relaxed fast ion profile resulting from a given set of Alfvènic instabilities, see Refs. [7][8][9]. Although the accuracy of the results from reduced models is expected to degrade with respect to more comprehensive codes, more insight on the problem under study can be gained by looking at a much larger number of cases. Clearly, the distinction between first-principle and reduced models is sometimes questionable, depending on the amount of simplifications introduced in the models and in their practical implementation. Under several aspects, the two approaches are complementary and their combined use can result in improved understanding of tokamak and plasma physics.

This paper reports on the development and initial validation of a new reduced model for fast ion transport by plasma instabilities such as Alfvénic modes. The model will be included in the tokamak transport code TRANSP [10][11], which is used on several tokamaks to either simulate existing discharges or to develop and predict new plasma scenarios. The general aspects of the new model are discussed in Sec. II. Section III describes the practical implementation and the integration of the new model with the existing TRANSP code and its modules. Initial verification and validation work is then presented in Sec. IV. Section V concludes the paper.

## II. DESCRIPTION OF THE NEW MODEL

The NUBEAM module [12][13] implemented in TRANSP models fast ion dynamic in tokamaks based on classical physics. In addition, NUBEAM has four possible implementations to model fast ion transport mechanisms different from classical. The first two models set the fast ion diffusivity to be proportional to the electron particle diffusivity (with or without corrections for the Ware pinch) through a user-selected multiplier. These models give a fast ion radial flux, $\Gamma_{f i}$, that is related to the electron density gradient. Clearly, such models do not capture the physics of resonant wave-particle interactions. A third model includes fast ion diffusion and convection coefficients as a function of radius, $D_{f i}(r)$ and $V_{f i}(r)$, so that $\Gamma_{f i}=-D_{f i} \nabla n_{f i}+n_{f i} V_{f i} . n_{f i}(r)$ is the radial
fast ion density profile as a function of the normalized minor radius $r$. The flux is therefore regulated by the spatial fast ion gradient, $\nabla n_{f i}$. Energy and space-dependent diffusion coefficients can be prescribed in a fourth model for (up to) six classes of particles: passing, barely passing, trapped, deeply trapped, counter-passing and counter barely passing. The actual diffusivity for each particle during the NUBEAM calculation is obtained as a weighted combination of two of those six coefficients, depending on the orbit localization in phase space. Although some dependence on the specific orbit topology is introduced, the resulting transport is still diffusive in real space, i.e. along the radial direction. In general, all these models do not contain the physics of resonant interaction - and resulting transport in phase space - between instabilities and fast ions. In fact, the resonance condition implies that only narrow regions in phase space may be strongly affected by the modes, whereas adjacent regions are possibly unaffected.

The following features should be included in a new fast ion transport model in TRANSP to mimic the resonant interaction between fast ions and instabilities:

1. Characterize particles based on their orbit topology [14], i.e. in terms of magnetic moment $\mu$, energy $E$ and canonical toroidal angular momentum $P_{\zeta}$, instead of real-space coordinates such as radius, poloidal/toroidal angles.
2. Model transport as steps (or kicks) in phase space, for instance kicks in energy associated with the resonant interaction. Radial transport will eventually result from the particle dynamics in phase space, but with no a priori assumptions on its nature, such as diffusive or convective.
3. Derive transport coefficients from consistent simulations or theory. Whenever possible, experimental data should be used as further constraints.
4. The model must be suitable for inclusion in the NUBEAM module. In this regard, a Monte Carlo framework seems to be the best approach.
5. Calculate variations of $E$ and $P_{\zeta}$ consistently.

Item no. 5 in the list above is actually the most distinctive feature for transport resulting from resonant wave-particle interactions. Based on the guiding center Hamiltonian formulation of the particle's motion in the presence of a mode with toroidal mode number $n$ and frequency $\omega=2 \pi f$, one obtains the relationship [14]:

$$
\begin{equation*}
\omega P_{\zeta}-n E=\text { const. } \tag{1}
\end{equation*}
$$

For a single mode, variations in $E$ and $P_{\zeta}$ for particles satisfying Eq. 1 (given a specific constant on the right-hand side [15]) are thus related through

$$
\begin{equation*}
\Delta P_{\zeta} / \Delta E=n / \omega \tag{2}
\end{equation*}
$$



FIG. 1: (Color online) Illustration of the correlated variation of energy and canonical angular momentum in the presence of a single mode with zero and finite frequency width, cf. Eq. 3.
which sets a constraint for the allowed trajectories in the $\left(E, P_{\zeta}\right)$ space. In reality, if a finite mode frequency width is assumed and if more than one mode are present, $\Delta E$ and $\Delta P_{\zeta}$ can depart from the ideal (linear) relation of Eq. 2, see Fig. 1 and Sec. II.

One possibility to satisfy the requirements described above would be to develop a module, interfaced with NUBEAM, that models the resonant wave-particle interaction. For example, the model could be a reduced version of the ORBIT code [16]. However, this approach is not very flexible: if one decides to use another code to manage the mode-particle interaction, an entirely new module has to be developed and included in NUBEAM.

Another possibility, that is the one discussed in this paper, is to split the problem into two parts: (i) derive a set of transport coefficients in some given form, and (ii) use those coefficients in NUBEAM for the actual computation of fast ion evolution. By doing so, the NUBEAM part of the problem can be developed independently of the different models (or theories) used to infer the transport coefficients.

The main ingredient of the new model discussed herein is the probability that a particle, whose orbit is characterized by the constants of motion $\left(P_{\zeta}, E, \mu\right)$, experiences a change over a time $\delta t$ in energy and canonical angular momentum of magnitude $\Delta E$ and $\Delta P_{\zeta}$ in the presence of a mode with amplitude $A_{\text {mode }}$. For simplicity, here and in the following it is assumed that $\mu$ is conserved. This is a reasonable assumption for low-frequency modes with $\omega \ll \omega_{c i}$ ( $\omega_{c i}$ being the ion cyclotron resonance frequency), such as TAEs [23]. However, the model can be generalized to include $\mu$ variations.

In the next Sections, the general principles inspiring the new model are first discussed for an ideal case with a single resonance and for a specific class of particles, then generalized to an arbitrary set of modes for the entire fast ion population.

## A. Single-mode, single-resonance case

In the presence of a single resonance, the motion of a specific class of particles satisfying Eqs. 1-2 is subject to simple constraints in the $\left(E, P_{\zeta}, \mu\right)$ space $[15][17]$. Even for this simple case, the shape of the distribution of steps in energy and canonical angular momentum can be rather complicated
and far from a simple bi-maxwellian distribution, from which diffusion coefficients in $E$ and $P_{\zeta}$ could be readily extracted. However, to illustrate the general ideas of the new model, we first assume that the bi-variate probability density function for $\Delta E$ and $\Delta P_{\zeta}$ changes of the particle's energy and canonical toroidal momentum can be approximated by

$$
\begin{align*}
& p\left(\Delta E, \Delta P_{\zeta} \mid P_{\zeta}, E, \mu, A_{\text {mode }}\right)=p_{0} \times \\
& e^{-\frac{1}{2(1-\rho)}\left[\frac{\left(\Delta E-\Delta E_{0}\right)^{2}}{\sigma_{E}^{2}}+\frac{\left(\Delta P_{\zeta}-\Delta P_{\zeta 0}\right)^{2}}{\sigma_{P_{\zeta}}^{2}}-2 \rho \frac{\left(\Delta E-\Delta E_{0}\right)\left(\Delta P_{\zeta}-\Delta P_{\zeta}\right)}{\sigma_{E} \sigma_{P_{\zeta}}}\right]} \tag{3}
\end{align*}
$$

with the normalization factor

$$
\begin{equation*}
p_{0}=\frac{1}{2 \pi \sigma_{E} \sigma_{P_{\zeta}} \sqrt{1-\rho^{2}}} \tag{4}
\end{equation*}
$$

(The dependence of all parameters on $A_{\text {mode }}$, e.g. $\sigma_{E}=\sigma_{E}\left(A_{\text {mode }}\right)$, has been omitted to simplify the notation). Here the variances $\sigma_{E}$ and $\sigma_{P_{\zeta}}$ give the spread of the distribution along the $\Delta E$ and $\Delta P_{\zeta}$ axes. The correlation parameter

$$
\begin{equation*}
\rho=\frac{<\left(\Delta E-\Delta E_{0}\right)\left(\Delta P_{\zeta}-\Delta P_{\zeta} 0\right)>}{\sigma_{E} \sigma_{P_{\zeta}}} \tag{5}
\end{equation*}
$$

takes into account the coupling between $\Delta E$ and $\Delta P_{\zeta}$ expressed in Eqs. 1-2:

$$
\begin{equation*}
\Delta P_{\zeta}(\Delta E)=\Delta P_{\zeta 0}+\operatorname{sign}(\rho) \times \frac{\sigma_{P_{\zeta}}}{\sigma_{E}}\left(\Delta E-\Delta E_{0}\right) \tag{6}
\end{equation*}
$$

The offset (or convective) terms $\Delta E_{0}$ and $\Delta P_{\zeta 0}$ are redundant and $\equiv 0$ for cases in which there is no systematic drift in energy or $P_{\zeta}$. They are included in the model for generality, e.g. to account for slowing down processes or transport mechanisms other than classical processes.

In principle, the set of probability density functions $p\left(\Delta E, \Delta P_{\zeta} \mid E, P_{\zeta}, \mu, A_{\text {mode }}\right)$ contains all the information required by NUBEAM to calculate the energy and $P_{\zeta}$ steps caused by resonant waveparticle interaction. In practice, if the analytical formulation from Eqs. 3-6 had to be adopted, a set of 4-D coefficients has to be given as input to NUBEAM:

$$
\left\{\begin{array}{l}
\sigma_{E}=\sigma_{E}\left(E, P_{\zeta}, \mu, A_{\text {mode }}\right)  \tag{7}\\
\sigma_{P_{\zeta}}=\sigma_{P_{\zeta}}\left(E, P_{\zeta}, \mu, A_{\text {mode }}\right) \\
\Delta E_{0}=\Delta E_{0}\left(E, P_{\zeta}, \mu, A_{\text {mode }}\right) \\
\Delta P_{\zeta 0}=\Delta P_{\zeta 0}\left(E, P_{\zeta}, \mu, A_{\text {mode }}\right) \\
\rho=\rho\left(E, P_{\zeta}, \mu, A_{\text {mode }}\right)
\end{array}\right.
$$

Incidentally, a similar term could be added to include variations of magnetic moment $\mu$ in the model, according to a probability density function $\sigma_{\mu}=\sigma_{\mu}\left(E, P_{\zeta}, \mu, A_{\text {mode }}\right)$.

This set of transport coefficients can be reduced, based on two considerations. Firstly, NUBEAM already computes the effects of (classical) scattering and slowing-down at each time step. Therefore, one can set $\Delta E_{0}=\Delta P_{\zeta 0} \equiv 0$ and simplify Eq. 3 accordingly. Secondly, ORBIT simulations indicate that $\sigma_{E}$ and $\sigma_{P_{\zeta}}$ have a (roughly) linear dependence on the normalized mode amplitude $A_{\text {mode }}$, cf.


FIG. 2: (a-c) Scan of mode amplitude (normalized to the experimental value, $A_{\text {mode }}=1$, from reflectometer's data). ORBIT runs include a single TAE mode. Initial particle distribution consists of 5000 particles, all within the same $\left(E, P_{\zeta}, \mu\right)$ bin but different toroidal location and hence different phase with respect to the mode. The parameters $\sigma_{E}$ and $\sigma_{P_{\zeta}}$ are obtained from a fit of ORBIT data with two bi-variate maxwellians, see Eq. 9. (d) Dependence of $\sigma_{E}$ (diamonds, black) and $\sigma_{P_{\zeta}}$ (triangles, red) on mode amplitude, showing a roughly linear relationship.

Fig. 2. Thus, only the coefficients for a specific value of $A_{\text {mode }}$ (for instance $A_{\text {mode }}=1$ ) have to be passed to NUBEAM, along with a separate vector of mode amplitude $v s$ time that is used to re-scale the coefficients as time evolves. (The validity of this simplification is further discussed in Sec. IV A and Fig. 14). By doing this, matrices in Eqs. 7 are reduced to three dimensions, i.e. the three variables $\left(E, P_{\zeta}, \mu\right)$ that identify orbits in phase space.

## B. Extension to the general, multi-mode case

The expressions introduced in the previous Section could be generalized to the case more commonly encountered in experiments of multiple modes (and multiple resonances, even for a single mode) inducing fast ion transport. For example, one could specify a set of coefficients for $N$ modes:

$$
\left\{\begin{array}{l}
\sigma_{E, i}=\sigma_{E, i}\left(E, P_{\zeta}, \mu\right)  \tag{8}\\
\sigma_{P_{\zeta}, i}=\sigma_{P_{\zeta}, i}\left(E, P_{\zeta}, \mu\right) \\
\rho_{i}=\rho_{i}\left(E, P_{\zeta}, \mu\right) \\
w_{i}=w_{i}\left(E, P_{\zeta}, \mu\right)
\end{array}\right.
$$

with $i=1 \ldots N . w_{i}$ is the relative weight of the $i$-th probability distribution, such that $\sum_{i=1}^{N} w_{i} \equiv 1$. The set of probabilities $\left\{p_{i}\right\}$ (see Eq. 3) are used as basis functions to model the total probability $p\left(\Delta E, \Delta P_{\zeta} \mid P_{\zeta}, E, \mu\right):$

$$
\begin{equation*}
p\left(\Delta E, \Delta P_{\zeta} \mid P_{\zeta}, E, \mu\right)=\Sigma_{i=1}^{N} w_{i} p_{i}\left(\Delta E, \Delta P_{\zeta} \mid P_{\zeta}, E, \mu\right) \tag{9}
\end{equation*}
$$

From initial tests based on ORBIT, $N \lesssim 4$ might be enough to model cases with multiple TAE modes, each characterized by different toroidal mode number, frequency and radial mode structure. However, the approach of using the analytical representation for the $p_{i}$ 's, complemented by the corresponding weight matrices $w_{i}$ 's, seems rather unpractical (although feasible) as the number of input files required by TRANSP would rapidly increase for scenarios that require $N>1$ to model the modes' impact on fast ions.

A more straightforward way to define the input required by TRANSP is to use the total $p\left(\Delta E, \Delta P_{\zeta} \mid E, P_{\zeta}, \mu\right)$ directly, without any attempt to reconstruct it based on specific expressions such as Eqs. 3-8. This requires a single file defining $p$ as a set of 2D matrices (with variables $\Delta E, \Delta P_{\zeta}$ ) as a function of $E, P_{\zeta}$ and $\mu$, with the clear advantage that a large number of scenarios can be effectively modeled (including resonant and stochastic transport) in a relatively simple and general way.

Furthermore, three observations help to introduce a time dependence in a simplified way:

1. For some practical cases, the scenario of interest is characterized by modes whose amplitude vary in time, but the relative amplitudes do not (at least on average, when time steps $\gtrsim 1 \mathrm{~ms}$ are considered). Therefore, providing the temporal evolution of the total mode amplitude, $A_{\text {mode }}(t)$, as a 1D vector would be enough to describe the evolution of the entire set of modes.
2. As noted before, $\sigma_{E}$ and $\sigma_{P_{\zeta}}$ are roughly proportional to the total mode amplitude, e.g. $\sigma_{E} \propto$ $A_{\text {mode }}$ (Fig. 2d). (Note that, if $\sigma_{E}, \sigma_{P_{\zeta}}$ are interpreted as equivalent diffusion coefficients such as $D_{E} \propto \sigma^{2} / \delta t$, the proportionality gives the expected dependence $D_{E} \propto A_{\text {mode }}^{2}$ for diffusive transport).
3. Boundaries and shape of the domain $\left(E, P_{\zeta}, \mu\right)$ evolve in time during a discharge, for instance because of the evolution of the $q$-profile. For practical purposes, one can assume that the same domain can be used at different times with appropriate normalizations, e.g. based on the magnetic flux at the boundary for $P_{\zeta}$, or on the magnetic field on axis for $\mu$.

The proposed formulation is suitable for a straightforward inclusion of magnetic moment variations, that have been neglected so far. In order to preserve possible correlations between changes of $E, P_{\zeta}$ and $\mu$, the general probability function should then be extended to $p\left(\Delta E, \Delta P_{\zeta}, \Delta \mu \mid E, P_{\zeta}, \mu\right)$, i.e. as a 6 -dimensional matrix.

## III. PRACTICAL IMPLEMENTATION OF THE TRANSPORT MODEL

## A. Deriving the transport coefficients

The NSTX [18] reference case used to illustrate how the input for TRANSP can be defined is discussed in Ref. [19] and summarized in Fig. 3. It consists of a NSTX H-mode plasma with bursts of $n=1-6$ TAE activity from $\sim 0.2 \mathrm{~s}$ to $\sim 0.4 \mathrm{~s}$. The modes have a more stationary character after 0.4 s , when strong low-frequency MHD activity is also detected.


FIG. 3: (Color online) NSTX scenario used to illustrate how input quantities for the new model of fast ion transport in NUBEAM/TRANSP can be derived from an experiment. (a) Spectrogram from Mirnov coils located at the plasma edge. (b) Neutron rate showing repetitive drops coincident with bursts of TAE activity. The arrow indicates the specific event that will be further discussed later in the paper.


FIG. 4: Examples of fast ion orbits in NSTX in the presence of 4 TAE modes. (a) Orbits in real space in a NSTX poloidal cross-section. (b) Equivalent phase-space representation.

TAE modes are analyzed with the NOVA-K code [20] following the procedure outlined in Ref. [21]. This provides the mode structure. The perturbation amplitude associated with each mode is obtained by comparing the simulated density response (in arbitrary units) to the modes with that measured through the UCLA reflectometer system [22] installed on NSTX.

The plasma equilibrium at a given time and the mode structures are used in the particlefollowing code ORBIT to characterize the fast ion population (Fig. 4) and simulate the fast ion response in terms of transport, including loss, redistribution and energy change. In the following example, the reference time is chosen at $t \approx 0.27 \mathrm{~s}$, when the mode amplitude is sufficiently large
to obtain good reflectometer data.
Numerically or analytically obtaining the probability function $p\left(\Delta E, \Delta P_{\zeta}\right)$ using expressions for the particle orbit and eigenmode structure is extremely difficult. In particular, modes are localized on flux surfaces, but high energy particle orbits are not, whereby a particle may experience large variations in mode amplitude in a single toroidal transit. Strength and location of resonances can only be determined by special numerical methods [15][17].

A single ORBIT run with a sufficiently large number of test particles is used to calculate $p\left(\Delta E, \Delta P_{\zeta} \mid E, P_{\zeta}, \mu\right)$. Particles are initialized uniformly in the $\left(E, P_{\zeta}, \mu\right)$ space. A uniform distribution in phase space is necessary to prevent gradients in the fast ion distribution to affect the computed $p\left(\Delta E, \Delta P_{\zeta}\right)$. Runs simulating $\sim 1 \mathrm{~ms}$, corresponding to tens or hundreds of toroidal transit times, are used. The mode amplitude is kept constant ( $A_{\text {mode }}=1$ ). Mode frequencies are also constant. During the run, each particle is tracked at fixed intervals $\delta t_{s i m}$ and the main parameters (including energy, $P_{\zeta}, \mu$, orbit type) are recorded.

ORBIT results are then processed to infer $p\left(\Delta E, \Delta P_{\zeta}\right)$. Variations in $E$ and $P_{\zeta}$ are calculated at each step, providing an ensemble of values over the whole phase space:

$$
\left\{\begin{array}{l}
\Delta E\left(E, P_{\zeta}, \mu\right)  \tag{10}\\
\Delta P_{\zeta}\left(E, P_{\zeta}, \mu\right)
\end{array}\right.
$$

This ensemble is then re-sampled based on a discrete grid in $\left(E, P_{\zeta}, \mu\right)$, and the probability distribution function is computed as a 2D histogram for each bin in the grid. A normalization is applied to ensure that $\Sigma_{\Delta E, \Delta P_{\zeta}} p\left(\Delta E, \Delta P_{\zeta}\right) \equiv 1$ for each bin. These steps define the probability matrix that is used as input in NUBEAM/TRANSP.

## B. Obtaining the mode amplitude scaling factor

Different approaches can be used to compute the mode amplitude scaling factor, $A_{\text {mode }}(t)$. Ideally, experimental measurements of the actual mode amplitude are used. Diagnostics such as reflectometers, electron-cyclotron emission radiometers or beam emission spectroscopy are good examples. In some cases, however, internal measurements of the mode amplitude are limited or not directly available. Additional modeling is required in these cases to infer $A_{\text {mode }}(t)$. In the following, a simple method based on commonly available neutron rate measurements is described. It is assumed that mode amplitude is known at (at least) one time during the discharge. By varying the mode amplitude in ORBIT simulations with respect to the measured one, one can obtain the relationship between mode amplitude and expected drop in the neutron rate, see Fig. 5. This graph, along with the measured neutron rate evolution, can be used to derive the time-dependent $A_{\text {mode }}(t)$, which is then used as input for NUBEAM/TRANSP.

In practice, one calculates the instantaneous relative neutron rate variation, $\Delta R_{n}(t) / R_{n}(t)$, from the measured neutron time-trace. At each time, $\Delta R_{n}(t) / R_{n}(t)$ is then used to calculate the normalized mode amplitude that corresponds to that change from the relationship shown in


FIG. 5: Scan of fractional neutron rate drop as a function of constant mode amplitude from the ORBIT code. $A_{\text {rel }}=1$ corresponds to the nominal experimental values of mode amplitude for which $p\left(\Delta E, \Delta P_{\zeta}\right)$ is computed.

Fig. 5. These steps are illustrated in Fig. 6. For comparison, the mode amplitude scaling factor from neutron rate and from Mirnov coils located at the plasma edge is shown in Fig. 6c. Both methods succeed in identifying times with TAE bursts. The waveform from neutron rate appears smoother, mainly because of the filtering of the raw data required to compute time derivatives without large spikes and noise. The consequences of a different input for $A_{\text {mode }}(t)$ are briefly discussed in Sec. IV B.

## C. Algorithm implementation in NUBEAM/TRANSP

The fast ion transport model presented in the previous Sections has recently been implemented in Fortran and interfaced with the NUBEAM code. A flowchart of the model's implementation is shown in Fig. 7. The model acts on the fast ion distribution in between two steps of NUBEAM. Initial conditions are read from the so-called plasma state structure of TRANSP, which contains information on machine configuration (e.g. machine size, structures, parameters of NB injection and other auxiliary heating systems) and current plasma and equilibrium parameters (such as magnetic equilibrium, plasma profiles).

The first step in the model is to convert the fast ion distribution $F_{n b}$ from real-space variables $(R, Z, E, p)$ to phase space variables $\left(E, P_{\zeta}, \mu\right)$. Note that the three variables ( $E, P_{\zeta}, \mu$ ) (and sometimes the sign of the parallel velocity) defines a complete orbit in an axisymmetric system, whereas $(R, Z, E, p)$ define a single point on that orbit. Since the timescale for distribution modification is long compared to transit times, variables $\left(E, P_{\zeta}, \mu\right)$ are the relevant ones. Within the NUBEAM/TRANSP framework, this conversion from single-point (instantaneous) to orbit representation of the particle distribution is valid because of the statistical approach used in the code, i.e. the code evolves the distribution as a statistical ensemble rather than keeping track of each particle separately.

Information on the mode amplitude evolution for the current NUBEAM step is recovered from the input file. Then, the model evolves each particle according to its location in phase space


FIG. 6: Calculation of normalized mode amplitude evolution based on the measured neutron rate and using the relationship between neutron variation and normalized mode amplitude from ORBIT, see Fig. 5. (a) Measured neutron rate (black) and cumulative neutron deficit (red). Also shown are the reconstructed neutron rate in the absence of modes (blue) and the deficit that would result from fast ion loss only (yellow), i.e. without taking into account the energy variation induced by the wave-particle interaction with the TAE modes. (b) Mode amplitude $A_{\text {mode }}(t)$ normalized to the peak mode amplitude at $t=268.7 \mathrm{~ms}$, obtained from the measured neutron rate evolution and the graph in Fig. 5. (c) Comparison between $A_{\text {mode }}(t)$ from neutrons and from Mirnov coils data over a limited time range.
and to the given mode amplitude. After the full MonteCarlo step for $\left(E, P_{\zeta}, \mu\right)$, all remaining particle's parameters are updated and the possibly new position in $(R, Z)$ is re-computed. This leads to the conversion of $F_{n b}\left(E, P_{\zeta}, \mu\right)$ back to the initial representation in terms of ( $R, Z, E, p$ ) required by NUBEAM/TRANSP. Once the updated $F_{n b}$ is known, information is passed back to NUBEAM/TRANSP to update the plasma state and begin a new time step.

The full procedure is summarized here below:

1. A TRANSP input file is defined for the step probability distribution function, $p\left(\Delta E, \Delta P_{\zeta} \mid E, P_{\zeta}, \mu\right)$, that is used as input to TRANSP. This consists of a 5 D matrix of probability values. Two variables define the $\left(\Delta E, \Delta P_{\zeta}\right)$ grid over which the probability for a given region in phase space $\left(E, P_{\zeta}, \mu\right)$ is provided. The remaining three variables define the discrete regions (or bins) into which the phase space is divided.
2. The time evolution of the total mode amplitude is specified as a 1 D array in a separate input file.
3. The two input files, along with the appropriate switches in the standard TRANSP parameter


FIG. 7: (Color online) Flowchart of the model as implemented in NUBEAM.
list, completely describe the input for a given set of modes with (possibly) time-varying amplitude.
4. At the beginning of the TRANSP run, the probability matrix is recovered from the input files. Variables in $p\left(\Delta E, \Delta P_{\zeta}\right)$ are updated during the run to preserve the correct orbit topology, based on q-profile, magnetic equilibrium [14].
5. The next step is to update the particles' trajectory at each iteration of NUBEAM. Classical mechanisms (slowing-down, scattering) are treated in the standard way. Only the effects of resonant modes are discussed here.
6. For a particle characterized by values $\left(P_{\zeta}, E, \mu\right)$, one can identify the corresponding bin in the probability matrix and proceed to the random sampling of the kicks in $E$ and $P_{\zeta}$ for the next iteration. The steps for the $i$-th particle are indicated as $\Delta E_{i}$ and $\Delta P_{\zeta, i}$. (More details on how particle's energy and $P_{\zeta}$ may be advanced in practice are given in the next Section).
7. Now proceed to the calculation of the $E$ and $P_{\zeta}$ variations for a time step of duration $\delta t_{\text {step }}$. Based on the time step used to compute $p\left(\Delta E, \Delta P_{\zeta}\right)$, indicated as $t_{\text {step }}^{s i m}$, the step $\delta t_{\text {step }}$ is divided into $N_{\text {steps }}$ smaller time intervals of duration $t_{\text {step }}^{\text {sim }}$ and the total variation of $E$ and $P_{\zeta}$ is calculated as the result of a correlated random walk in time. The mode amplitude during the time step may vary according to the input $A_{\text {mode }}(t)$. The $\Delta E$ and $\Delta P_{\zeta}$ steps are calculated from the randomly extracted $\Delta E_{i}$ and $\Delta P_{\zeta, i}$, and $E$ and $P_{\zeta}$ are then updated.
8. Loop over particles.
9. Update other variables such as radius, poloidal angle, of the particles.


FIG. 8: Example of $E, P_{\zeta}$ temporal evolution for particles with different initial values of $\left(E, P_{\zeta}\right)$. Particles in red and cyan are lost after a few microseconds.

## D. MonteCarlo extraction of steps $\Delta E_{i}, \Delta P_{\zeta, i}$

The random extraction of $\Delta E_{i}$ and $\Delta P_{\zeta, i}$ is arguably the most important step in the procedure depicted above. An important feature is that the particle motion is characterized by different time scales, see Fig. 8. Firstly, particles oscillate in the wave field over periods $\simeq 1 / f_{\text {mode }}$, that is typically much shorter than the time step used in simulations with NUBEAM/TRANSP. For many particles with similar parameters but different phase with respect to the modes, this fast motion results in a spreading of energy and $P_{\zeta}$ around the initial values. Secondly, the average particle energy and $P_{\zeta}$ drift over time scales of several toroidal transit times. This second time scale is the relevant one for the process under study. What makes these constraints important for calculating the particle trajectory in the $\left(P_{\zeta}, E, \mu\right)$ space is that the particle motion is not purely periodic and it can be skewed toward positive as well as negative values of $\Delta E$ and $\Delta P_{\zeta}$. In other words, over time scales of 100 's $\mu$ s a specific particle can (i) fluctuate around its instantaneous energy value, but (ii) slowly drift away from the initial energy, cf. Fig. 8. When the concept is extended from a single particle to a statistically significant ensemble of particles, a net gain or loss of energy can emerge.

Moreover, each $p\left(\Delta E, \Delta P_{\zeta}\right)$ for a given bin $\left(P_{\zeta}, E, \mu\right)$ may, in general, contain both resonant and non-resonant particles because of the discrete grid used to cover the $\left(P_{\zeta}, E, \mu\right)$ space. The algorithm used to evolve $F_{n b}$ must be able to keep track of the 'class' to which a particle belongs, or else, for example, a non-resonant particle will have a finite probability to experience large energy and $P_{\zeta}$ excursions, which would lead to wrong results. To illustrate that, suppose the $p\left(\Delta E, \Delta P_{\zeta}\right)$ for a specific bin is composed by two distinct components, that are hereafter indicated by their typical energy step only. The first group has negligible $\Delta E_{1} \sim 0$ and is classified as non-resonant particles. The second group has large $\Delta E_{2} \sim 5 \mathrm{keV}$ and is dubbed as resonant particles. If the average step $\Delta E$ is sampled randomly at each sub-step, particles in the first group may receive an occasional kick $\Delta E_{2} \gg \Delta E_{1}$. As a result of the unbiased sampling, the final distribution will


FIG. 9: Qualitative derivation of the scheme to evolve particles' energy and $P_{\zeta}$. (a) For a single particle oscillating in the wave field, the probability function to experience a step $\Delta E$, shown by the line in the right panel of (a), is approximated by two delta functions at $\pm \Delta E$. (b) When all particles experiencing a kick $|\Delta E|$ and a drift in energy are taken into account, an asymmetric distribution appears.
be much broader than it should be, even if the extra-kick does not happen frequently for particles in the first group. The main consequence to develop a scheme to evolve $F_{n b}$ in time is that the motion has to be described as a correlated random walk, rather than a simple random walk with every particle's step totally un-correlated from the previous one. This is implemented in the new model in a semi-empirical way. The following explanation is carried out for energy variations only, then extended to the $\Delta E, \Delta P_{\zeta}$ case under consideration by implicitly invoking the constraint in Eq. 2.

To evolve the particles, the energy variation after a time $\delta t_{\text {step }}$ has to be reconstructed starting from the available $p(\Delta E)$, which is computed for $t_{s t e p}^{s i m} \ll \delta t_{\text {step }}$. Begin by associating a step $\Delta E$, randomly extracted from $p(\Delta E)$, to a particle (Fig. 9). Assume that $\pm \Delta E$ represents the maximum energy variation that that particle can experience under the effects of the oscillating wave field. The particle's energy will vary in time as

$$
\begin{equation*}
E(t) \sim E_{0}+\Delta E \sin \left[\phi(t)+\phi_{0}\right]+\delta E(t) \tag{11}
\end{equation*}
$$

where $\phi(t)$ is the phase between particle and wave $(\mathrm{s}), \phi_{0}$ a random initial phase and $\delta E(t)$ accounts for possible (secular) drifts caused by resonances. For $\delta E$ sufficiently small over a step of duration $t_{s t e p}^{s i m}$, the probability that the particle will have an energy variation $x$ at a certain time is thus

$$
\begin{equation*}
p(x) \approx \frac{1}{\pi \sqrt{\Delta E^{2}-x^{2}}},-\Delta E \leq x \leq \Delta E \tag{12}
\end{equation*}
$$

which is further simplified as

$$
\begin{equation*}
p(\Delta E) \approx \frac{\delta\left(\Delta E^{+}\right)+\delta\left(\Delta E^{-}\right)}{2} \tag{13}
\end{equation*}
$$

with $\Delta E^{+} \doteq+\Delta E$ and $\Delta E^{-} \doteq-\Delta E$. This particle is now assumed to be representative of an ensemble of particles with characteristic step $|\Delta E|$, see Fig. 9b. In general, $p(\Delta E)$ may not be
symmetric for the ensemble if $\delta E(t) \neq 0$. Estimate the average energy change, $\overline{\Delta E}$, after $N_{\text {steps }}$ of duration $t_{\text {step }}^{s i m}$ for the ensemble characterized by this $|\Delta E|$ :

$$
\begin{equation*}
\overline{\Delta E} \approx \Sigma_{j=1}^{N_{\text {steps }}^{+}} \Delta E^{+}+\Sigma_{k=1}^{N_{\text {steps }}^{-}} \Delta E^{-} \tag{14}
\end{equation*}
$$

where $N_{\text {steps }}^{+}\left(N_{\text {steps }}^{-}\right)$is the number of steps with positive (negative) energy variation.
Now define the probability for either positive or negative variations, $p_{+} \doteq p(+\Delta E)$ and $p_{-} \doteq$ $p(-\Delta E)$. For $N_{\text {steps }}$ sufficiently large, the probability that the particle will experience a positive energy kick at each step is given by $p_{+} /\left(p_{+}+p_{-}\right)$(and similarly for negative kicks), therefore Eq. 14 can be rewritten as

$$
\begin{equation*}
\underbrace{\left[\Sigma_{j \text { steps }}^{+}(+1)\right.}_{N_{\text {steps } s} \frac{p_{+}}{p_{+}+p_{-}}}+\underbrace{\left.\Sigma_{k=1}^{N_{s t e p s}^{-}}(-1)\right]}_{N_{\text {steps }}^{+} \frac{p_{-}}{p_{+}+p_{-}}} \times \Delta E \rightarrow \underbrace{\Sigma_{j=1}^{N_{\text {steps }}} S_{r, k}}_{N_{\text {steps }} \frac{p_{+}-p_{-}}{p_{+}+p_{-}}} \Delta E \tag{15}
\end{equation*}
$$

where $S_{r, k}$ is the sign of a random number uniformly extracted from $\left[-p_{-} /\left(p_{+}+p_{-}\right), p_{+} /\left(p_{+}+p_{-}\right)\right]$ at each step. Finally, since the step ordering in Eq. 14 is probabilistic, the overall $\overline{\Delta E}$ from Eqs. 1415 can be cast as

$$
\begin{equation*}
\overline{\Delta E} \approx \Sigma_{k=1}^{N_{\text {steps }}} S_{r, k} \Delta E A_{\text {mode }, k} \tag{16}
\end{equation*}
$$

with the substitution $\Delta E \rightarrow \Delta E A_{\text {mode }, k}$ at each step $k$ to account for the proportionality $\sigma_{E} \propto$ $A_{\text {mode }}$, cf. Fig. 2.

On the basis of this semi-empirical derivation, the overall $\Delta E$ and $\Delta P_{\zeta}$ over a time $\delta t_{\text {step }}$ are calculated as the result of multiple steps, each of duration $t_{\text {step }}^{s i m}$ that is sufficiently shorter than $\delta t_{\text {step }}$. For example, the tests presented hereafter have $t_{\text {step }}^{s i m} \ll \delta t_{\text {step }} / 10$. The kicks $\Delta E$ and $\Delta P_{\zeta}$ are calculated for the first step only. The only exception is when a particle moves from one bin to another in $\left(P_{\zeta}, E, \mu\right)$ before the full step $\delta t_{\text {step }}$ has been covered, for example because it experiences a large energy kick. In this case, new values of $\Delta E$ and $\Delta P_{\zeta}$ are sampled based on the new phase space coordinates.

## IV. VERIFICATION OF THE REDUCED MODEL

## A. Verification against ORBIT simulations

In this Section, the algorithm that implements the new transport model is verified against full ORBIT simulations for the scenario introduced in Fig. 3. Because a realistic modeling of fast ion dynamic in phase space is at the core of the new model, the ability of the code to identify and evolve fast ion orbits is first tested. For a given fast ion distribution (e.g. from NUBEAM/TRANSP), orbits are classified and their trajectory reconstructed in both real and phase space [14], see Figs. 1011.

Figure 10a shows a co-passing, confined fast ion that is pushed into a trapped confined region by the interaction with TAE modes. The change in orbit type is clear from its projection in the


FIG. 10: (Color online) Illustration of orbit topology change induced by TAE modes in (a) real space and (b) phase space. Particle's parameters are reported in (a). Dark (light) colors for the orbit indicate co-going (counter-going) motion. The particle's trajectory in phase space is shown in (b) as colored line connecting the initial orbit (red square) to the final orbit (green diamond). Final location of other particles with similar initial energy are shown by the symbols.


FIG. 11: (Color online) Same as in Fig. 10 for a lost co-passing particle. Note that, in addition to the particle's initial (blue) and final (red) orbits, the code correctly identify other orbits for confined counterpassing particles (yellow and green orbits) in the same phase space region.
$(R, Z)$ poloidal cross section of NSTX. The evolution of the orbit in the corresponding $\left(P_{\zeta}, \mu\right)$ plane (Fig. 10b) shows that, as the particle loses energy and reaches a more negative $\Psi$ (i.e., larger minor radius), it first moves on a potato orbit and finally it becomes a trapped particle.

Similarly, Fig. 11 shows the loss process for a co-passing, confined particle at larger pitch that crosses the loss boundary and hits the wall. It is interesting to note that the final orbit resides


FIG. 12: (Color online) Test of the Fortran algorithm to evolve $F_{n b}$ over 5 ms according to a given $p\left(\Delta E, \Delta P_{\zeta} \mid P_{\zeta}, E, \mu\right)$ and $A_{\text {mode }}(t)$. Results from the Fortran code (red triangles) are compared to full simulations performed with ORBIT (black diamonds). Through ORBIT, $p\left(\Delta E, \Delta P_{\zeta}\right)$ is calculated using steps $t_{s t e p}^{s i m}=25 \mu \mathrm{~s}$. Scatter plots of energy and $P_{\zeta}$ variations are shown in (a-d). The corresponding distributions from the model and from ORBIT are compared in (e-j).Test particles are selected with values of $E$, $P_{\zeta}$ and $\mu$ corresponding to (e,f) co-passing, (g,h) trapped and (i,j) all particles with $E \geq 10 \mathrm{keV}$.
in a region of phase space where both co-passing lost and counter-passing confined orbits coexist (Fig. 11b). By classifying the particles' orbit at each MonteCarlo time-step, the code can still resolve the correct orbit evolution.

A comparison of the evolution of the entire distribution from ORBIT and from the reduced model is shown in Fig. 12. Histograms for $E$ and $P_{\zeta}$ variations are shown for co-passing, trapped and all particles in the original distribution. Considering the simplicity of the model, the agreement between the two codes is satisfactory over at least three orders of magnitude. Possibly, the only exception is in the energy and $P_{\zeta}$ variations for trapped particles. This is attributed to the relatively poorer statistics for this phase space region, although uncertainties in the reconstructed probability $p\left(\Delta E, \Delta P_{\zeta} \mid E, P_{\zeta}, \mu\right)$ can not be completely ruled out.

Larger discrepancies between the Fortran algorithm and full ORBIT runs are observed when the overall mode amplitude evolution is scaled to smaller or larger values than those used to compute $p\left(\Delta E, \Delta P_{\zeta}\right)$, see Fig. 13. The cause for the increased discrepancy is illustrated in Fig. 14, where the second, third and fourth moments of the distributions of $\Delta E$ and $\Delta P_{\zeta}$ are shown as a function of amplitude scaling factor (nominal mode amplitude is $=1$ ) in the presence of 3 TAE modes. As seen in the figure, the standard deviation does indeed increase linearly with mode amplitude, similarly to what already shown for a single mode (cf. Fig. 2d). However, both skewness and kurtosis vary with mode amplitude, indicating that the shape of the probability distribution from ORBIT does vary with $A_{\text {mode }}$. In this case, the assumption of simple linear scaling of $\Delta E$ and $\Delta P_{\zeta}$ with $A_{\text {mode }}$ is not adequate to accurately reproduce the actual dependence $p=p\left(A_{\text {mode }}\right)$. Improvements


FIG. 13: (Color online) Probability distributions for the final energy step $\Delta E$ from full ORBIT simulations (black diamonds) and from the model (red triangles). The mode amplitude $A_{\text {mode }}(t)$ is scaled by a factor 0.25 up to 1.5 . Error bars are simply estimated as proportional to the square root of the number of counts in each energy bin.


FIG. 14: (Color online) Variations of the shape of the $p(\Delta E)$ and $p\left(\Delta P_{\zeta}\right)$ probability distributions as a function of the mode amplitude scaling factor are not directly observed in the standard deviation (a), but do appear in both skewness (b) and kurtosis (c) as they change with the scaling factor.
to the model to include more accurate scaling of the probability shape are under considerations. Nonetheless, this exercise provides an indication of the uncertainties in reconstructed fast ion evolution associated with computing $p\left(\Delta E, \Delta P_{\zeta}\right)$ at a single time for the reduced model, and then applying the same probability distribution to a broader time window.

The computed fast ion evolution in real space for this NSTX scenario is shown in Fig. 15. TAEs cause a redistribution to outer minor radii, with a drop in the number of fast ions near the plasma center $(\sqrt{\Psi} \lesssim 0.2)$ of $O(10 \%)$. The corresponding increase in fast ion population at outer radii appears small, but it should be considered that particles are diluted into regions with much larger


FIG. 15: (Color online) Computed redistribution of $F_{n b}$ over a 5 ms step with a burst of TAE activity. Shown are (a) profiles variation and (b) relative profile variation as a function of normalized minor radius. Solid (dashed) lines in (a) refer to the Fortran algorithm (ORBIT) simulation. Statistical uncertainties are assumed to be equal to the square root of the counts. Panel (c) show the estimated variation in NB driven current profile.
volume. The relative variation shown in Fig. 15b is more suitable to quantify the fast ion density increase at $\sqrt{\Psi} \gtrsim 0.4$. For this case, losses remain limited to $\ll 1 \%$, or $O(10)$ lost particles from the initial population of 34000 particles from NUBEAM.

The redistribution of fast ions is expected to affect other quantities, such as the amount of NB-driven current, here simply approximated by $I_{N B} \propto \Sigma_{k} p_{k} \sqrt{E_{k}}$, where the sum runs over all particles with $E \geq 10 \mathrm{keV}$ at each minor radius $\sqrt{\Psi}$. The results are shown in Fig. 15c. Redistribution of core fast ions causes a drop of $I_{N B}$ near the magnetic axis, and a slight increase for $\sqrt{\Psi} \gtrsim 0.6$.

## B. Initial tests within the NUBEAM/TRANSP framework

Before its final implementation in the NUBEAM module of TRANSP, the reduced model is tested with a stand-alone version of NUBEAM. Iterations between the two codes are used to test all the steps illustrated in the conceptual flowchart of Fig. 7. Plasma profiles such as density and temperature are assumed to be constant in time. Magnetic configuration is also considered as fixed. Without modifying this background scenario, the code evolves the fast ion population and


FIG. 16: (Color online) (a) Mode amplitude scaling factor derived from the measured neutron rate, cf. Fig. 6. (b) Measured (hatched region) and simulated neutron rate. Rates are normalized to their value at $t=266-267 \mathrm{~ms}$ (grey shaded region). Symbols refer to different time steps $\delta t_{\text {step }}$ for the macroscopic NUBEAM iterations. (c) Same as in (b), but forcing the reduced model to resample $\Delta E$ and $\Delta P_{\zeta}$ after a different number of time steps (parameter $N$ in the figure), each of which has duration $t_{s t e p}^{s i m}=25 \mu \mathrm{~s}$.
other quantities related to it, for instance neutron rate and NB-driven current profile.
The goal of these initial tests is to verify that the new model is capable to evolve fast ions over time periods of the order of (or longer then) typical collisional and slowing down times, i.e. $\gtrsim 10-20 \mathrm{~ms}$ for NSTX plasmas. Considering the scheme in Fig. 7, adjustable parameters for this simulation are the total duration of the simulation and the length of each NUBEAM step $k \rightarrow k+1$ required to cover that time range. The latter also defines how frequently the fast ion population is updated by the new model.

The results of simulations with varying step size are shown in Fig. 16, where measured and reconstructed neutron rate, $R_{n}$, are compared for a specific NSTX discharge. The mode amplitude scaling factor is derived from the neutron rate as discussed in Fig. 6. The measured neutron rate is divided by the central deuterium density at each time to account for the fact that plasma profiles are kept constant in time in the simulation. Neutron rates are then normalized to their value before TAE bursts begin, $t=266-267 \mathrm{~ms}$.

Figure 16b demonstrates that the new model is indeed reproducing the correct neutron rate (or,


FIG. 17: (Color online) Dependence of simulated neutron rate on mode amplitude. (a) Mode amplitude scaling factor rescaled by $k_{\text {scale }}=0.75,1$ and 1.25 times its nominal value. (b) Measured and simulated neutron rate, including the case with no modes for reference. Simulations have $\delta t_{\text {step }}=2 \mathrm{~ms}, N=80$. Solid lines represent linear fits of the simulated neutron rate, showing the same rate of increase in regions where mode activity is negligibly small.
rather, its correct temporal evolution). Exceptions to this are the runs in which iterations between the model and NUBEAM happen every 0.5 ms and 4 ms . The reason for this discrepancy is twofold, as shown in Fig. 16c. When $\delta t_{\text {steps }}$ between two NUBEAM iterations is $\ll 1 \mathrm{~ms}$, the steps $\Delta E$ and $\Delta P_{\zeta}$ are resampled too frequently in the model. The requirement of correlated random walk for the fast ion evolution is violated, resulting in a net increase in the total transport (see Sec. III C). This is confirmed by a test run with the standard $\delta t_{\text {step }}=2 \mathrm{~ms}$ but forcing the resampling of $\Delta E$ and $\Delta P_{\zeta}$ every $N=20$ steps, instead of the default $N=80$. Transport is artificially enhanced in this case. The second reason for discrepancy appears when $\delta t_{\text {steps }}$ approaches the reciprocal of the NB injection rate. Since the new model is applied here at the beginning of each step, this means that newly injected particles are not redistributed, resulting in smaller transport. The three cases with $\delta t_{\text {steps }}=4 \mathrm{~ms}$ in Fig. 16c confirm this interpretation. Transport is under-predicted (i.e., neutron rate is overestimated) with respect to the measured one for $\delta t_{\text {steps }}=1-2 \mathrm{~ms}$, unless $N$ is reduced to $<50$, thus causing a fictitious increase in transport as explained above. These two examples indicate that the value of $\delta t_{\text {steps }}$ must be chosen in the NUBEAM run to be much larger than the duration of the micro-steps in the model, $t_{s t e p}^{s i m}$, but sufficiently shorter than collisional and NB injection time scales.

Once the correct step size is adopted, it is useful to assess the sensitivity of the simulation results on the input parameters, and especially on the mode amplitude scaling factor, $A_{\text {mode }}$. Figure 17 illustrates the computed neutron rate for mode amplitudes varying by $\pm 25 \%$ from the nominal


FIG. 18: (Color online) Simulated effects of bursting TAE modes on fast ion and NB-driven current profiles. The radial variable $\rho$ corresponds to the normalized toroidal flux. Simulations have $\delta t_{\text {step }}=2 \mathrm{~ms}, N=80$. (a) Radial fast ion profile before, just after and 10 ms after the first TAE burst occurs. (b) Same as in (a) for the NB-driven current profile. Solid (dashed) lines in (a-b) refer to simulations without (with) enhanced transport from TAEs. Bottom panels show the temporal evolution of (c) NB-driven current $J_{n b}(\rho)$, (d) relative variation of $J_{n b}(\rho)$ normalized to the no-modes reference case and (e) relative variation of fast ion profile $F_{n b}(\rho)$ normalized to the no-modes case. The solid line in (c) shows $A_{\text {mode }}(t)$.
value. The case with $A_{\text {mode }}=0$ is also shown for reference. It can be seen that the time evolution of neutron rate is quite sensitive to $A_{\text {mode }}$. This is because $R_{n}$ at a given time depends in part on the previous history of the fast ion population. Inaccurate reconstructions of fast ion transport at earlier times cumulate, at least on time scales comparable to the slowing down time, leading to increased discrepancy for the wrong choice of $A_{\text {mode }}$. In practice, the neutron rate also evolves at a rate set by the NB injection rate at times with negligible mode activity. Any deviation between runs with different $A_{\text {mode }}$ is attributed to previous drops in $R_{n}$, which scales with $A_{\text {mode }}$.

The sensitivity of the reconstructed $R_{n}$ on the input $A_{\text {mode }}$ has two additional implications. Firstly, it is a confirmation (although indirect) that the implementation of the new model within NUBEAM/TRANSP does reflect the fast ion dynamics as obtained from the original full simulations with the ORBIT code. Secondly, it may be used to infer with some confidence transport levels associated with other modes that are not included in the computation of $p\left(\Delta E, \Delta P_{\zeta}\right)$, but may be present in the original experiment. Another implication of the tight dependence $R_{n}=R_{n}\left(A_{\text {mode }}\right)$ is that it may enable simulations in which the measured neutron rate is supplied as input, and $A_{\text {mode }}$ is determined during the run to match it. The possible implementation of this $R_{n}$-feedback scheme directly inside the model is left as future work.

Time evolution of the fast ion and NB-driven current profiles are finally considered as the last example in this Section, see Fig. 18. Similarly to the neutron rate, significant drops are observed
in both $F_{n b}$ and $J_{n b}$ when bursts of TAEs occur. It is important to note that, as for the neutron rate, the effects of each burst are not limited in time to the duration of the burst, but propagate over a much longer time span, of the order of the slowing down time.

## V. CONCLUSIONS

A new fast ion transport model has been developed for the tokamak transport code TRANSP. The model is based on a MonteCarlo approach to mimic the effects of instabilities on the fast ion population. A probability distribution matrix, along with a mode amplitude scaling factor, is used to define the fast ion response to the modes as a function of time and fast ion phase space coordinates. Verification of the new model against the guiding center code ORBIT has been performed. Initial tests with a stand-alone version of the NUBEAM module, which evolves the fast ion distribution in TRANSP, are successful. The implementation of the model in the NUBEAM module of TRANSP is under way.

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Information Services<br>Princeton Plasma Physics Laboratory<br>P.O. Box 451<br>Princeton, NJ 08543

Phone: 609-243-2245
Fax: 609-243-2751
e-mail: pppl_info@pppl.gov
Internet Address: http://www.pppl.gov

