

Mathematical Institute

# Gradient Flow Structure of the Landau Equation

#### Metastability, Mean-Field Particle Systems and Non Linear Processes

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- Plasma is the fourth state of matter formed by heating a gas at high temperatures (3,000 - 10,000 K) so electrons in a gas are separated from nuclei.
- Examples include stars, lightning, aurora borealis, interstellar matter, fluorescent lights, neon signs, etc...
- Main focus of the ITER project is to produce net energy through fusion - four times more energy than nuclear, four million times more than coal, oil, or gas.
- ITER members China, EU, India, Japan, Korea, Russia, and the US.
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Figure: KSTAR tokamak plasma image from the National Fusion Research Institute of Korea

For  $\gamma \in [-3,1)$ , evolution of density, f, of plasma modelled by

$$\partial_t f = \nabla \cdot \left( f \underbrace{\int_{\mathbb{R}^d} f_* |v - v_*|^{\gamma + 2} \Pi[v - v_*] (\nabla \log f - \nabla_* \log f_*) dv_*}_{\text{nonlocal nonlinear 'velocity'}} \right)$$

For  $z \in \mathbb{R}^d$ , the matrix  $\Pi[z]$  is the projection onto  $\{z\}^{\perp}$ 

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$$\Pi[z] := \left( Id - \frac{z \otimes z}{|z|^2} \right).$$

 $|v - v_*|^{\gamma+2}\Pi[v - v_*]$  can be singular for negative enough  $\gamma$  and it is also non-negative semi-definite.

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#### Landau as a parabolic equation

Repackage the **non-linear and non-local** (c.f. Gualdani and Guillen '16-'21) coefficients of Landau

$$\partial_t f = \nabla \cdot (\bar{a}[f] \nabla f - \bar{b}[f] f),$$

with

$$\bar{a}[f] = a * f = \int_{\mathbb{R}^d} |v - v_*|^{2+\gamma} \prod [v - v_*] f(v_*) dv_* \gtrsim_f \langle v \rangle^{\gamma}$$

and

$$\bar{b}[f] = \nabla \cdot \bar{a}[f] = -(d-1) \int_{\mathbb{R}^d} |v - v_*|^\gamma (v - v_*) f(v_*) dv_* < +\infty \quad \longleftarrow \quad f \in L^{\frac{d}{\gamma+1+d}}_{loc}.$$

When  $\gamma = -d$ , then  $\nabla \cdot \bar{b}[f] = -C_d f$  which 'suggests' finite-time blow up from  $\dot{f} = f^2$ ??? **OPEN** - community believes no blow up due to partial results [GGIV'19, DHJ'20, BGS'21].

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As a diffusion equation, we consider solutions f which are probabilities. Suppose  $V \sim f.$  Then

$$dV = 2\bar{b}[f](V)dt + (2\bar{a}[f](V))^{\frac{1}{2}} dB_t.$$

This perspective of Landau has been studied by Fournier, Guérin, Hauray, Heydecker, and Mouhot. Good progress made for  $\gamma \ge -2$  when d = 3. Partial progress for  $\gamma \in (-3, -2)$  and degenerating as  $\gamma \downarrow -3$ .

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$$dV^{i} = 2\bar{b}[\mu^{N}](V^{i})dt + (2\bar{a}[\mu^{N}](V^{i}))^{\frac{1}{2}}dB^{i}_{t}, \quad i = 1, \dots, N,$$

with  $\mu^N = \frac{1}{N} \sum_{j=1}^N \delta_{V^j}$ . Done by Fournier and Hauray '16 for  $\gamma > -2$ .

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This perspective of Landau has been studied by Fournier, Guérin, Hauray, Heydecker, and Mouhot. Good progress made for  $\gamma \ge -2$  when d = 3. Partial progress for  $\gamma \in (-3, -2)$  and degenerating as  $\gamma \downarrow -3$ . The question of (global) **uniqueness** for the most physically relevant case  $\gamma = -3$  is **OPEN**. Stochastic techniques (coupling method) used by Fournier and Guérin in 2009 to prove conditional uniqueness.

- γ ∈ (−2, 0) global uniqueness and stability conditional to finite initial moments and entropy.
- ▶  $\gamma \in (-3, -2]$  **local** uniqueness and stability conditional on initial  $L^p$ ,  $p(\gamma) > 3/3 + \gamma$ .

## Outline

# Landau Equation Literature overview H-theorem

Preview of Results

# Gradient Flow framework

Review of heat equation Treatment of Landau

# Brief discussion on numerics

- ▶  $\gamma \in (0, 1)$  corresponds to 'hard potentials' (Desvillettes and Villani [DV00, DV02]).
- ▶  $\gamma = 0$  corresponds to 'Maxwellian' molecules (Villani [V98]).
- γ = -3 corresponds to 'Coulomb' interactions (first global uniqueness result by Guo [G02] using a perturbative argument).

General uniqueness for  $\gamma = -3$  is unknown, although Fournier and Guérin [FG09] have conditional results down to  $\gamma > -3$  using stochastic analytic techniques. More recent work due to Fournier and Heydecker [FH21].

Regularity results by extending DeGiorgi-Nash-Moser in inhomogeneous case rely on **interplay between parabolic and kinetic theory** by Golse, Guérand, Imbert, Loher, Mouhot, Silvestre, Schwab, Vasseur [GIMV19,IM20,GH15,SS16,GM21, L22].

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### More literature

- We want a gradient flow description for the Landau equation extending the ideas from Erbar and Villani [E16, V98].
- Erbar discovered the gradient flow characterisation of the Boltzmann equation with Maxwellian (bounded, γ = 0) kernels.
- The Landau equation can be derived from the Boltzmann equation through the grazing collision limit [DL92, D92].
- 'The lack of gradient flow structure contributes to the mathematical difficulty of the Boltzmann equation.' - Villani [V02].

#### H-theorem

 $\mathcal{H}(f) = \int f \log f$  is a Lyapunov functional for Landau. Using  $\log f$  as a test function gives

$$\mathcal{H}(f_t) - \mathcal{H}(f_0) = -\int_0^t \underbrace{\frac{1}{2} \iint_{\mathbb{R}^{2d}} ff_* |v - v_*|^{\gamma+2} |\Pi[v - v_*] (\nabla \log f - \nabla_* \log f_*)|^2 dv_* dv}_{=:D_L(f) \ge 0} dt.$$

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We interpret this entropy-dissipation equality as a **steepest gradient descent** of  $\mathcal{H}$  under the flow of Landau - extend notion of H-solutions by Villani [V98].

$$\partial_t f = -\nabla_{d_L} \mathcal{H}(f)$$
, for some metric  $d_L$ .

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Desvillettes proved the functional inequality [D15, D16]

$$\int \langle \mathbf{v} \rangle^{\gamma} \, \frac{|\nabla f|^2}{f} + \int \langle \mathbf{v} \rangle^{\gamma} \, \frac{|\mathbf{v} \times \nabla f|^2}{f} \leq C(D_L(f) + 1),$$

C > 0 depends only on bounds for

$$\int \langle v \rangle^2 f, \quad \mathcal{H}(f).$$

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# Preview of Results from CDDW20+

# Theorem (There is a 'good' metric $d_L$ )

There exists a (pseudo)-metric  $d_L$  on the space of probability measures with bounded second moment,  $\mathcal{P}_2(\mathbb{R}^d)$  such that

- d<sub>L</sub> metrises a complete topology
- d<sub>L</sub>-convergent (resp. bounded) sequences are weakly convergent (resp. compact).
- $(\mu_0, \mu_1) \mapsto d_L(\mu_0, \mu_1)$  is weakly lower semicontinuous.
- d<sub>L</sub> induces a geodesic space.

We define gradient flows of  $\mathcal{H}$  with respect to  $d_L$  to be curves  $f_t$  satisfying

$$\mathcal{H}(f_t) - \mathcal{H}(f_0) = -\frac{1}{2} \int_0^t |\dot{f}|_{d_L}^2(s) ds - \frac{1}{2} \int_0^t D_L(f_s) ds.$$

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# Theorem (Landau Gradient flow for a regularised problem) For a specific regularisation of the Landau equation [CHWW20], gradient flows of a regularised Boltzmann entropy with respect to $d_L$ exist and all gradient flows are equivalent to the usual notion of weak solutions in all dimensions $d \ge 3$ and $\gamma \in [-4, 0]$ .

For a regularisation parameter  $\epsilon > 0$ , these curves satisfy

$$\mathcal{H}^{\epsilon}(f_t) - \mathcal{H}^{\epsilon}(f_0) = -\frac{1}{2} \int_0^t |\dot{f}|^2_{d_L}(s) ds - \frac{1}{2} \int_0^t D_L^{\epsilon}(f_s) ds.$$

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# Theorem (Landau gradient flow)

Fix d = 3 and  $\gamma \in (-3, 0]$ . All H-solutions [V98]  $f_t$  defined on [0, T] subject to the assumptions;

- ►  $\mathcal{H}(f) \in L^{\infty}_t$ ,
- ►  $D_L(f) \in L^1_t$ ,
- there exists  $p(\gamma) \in [1,\infty]$  such that

 $(1+|v|^2)^{1-rac{\gamma}{2}}f_t(v)\in L^\infty_t(0,\,T;\,L^1_v\cap L^{p(\gamma)}_v(\mathbb{R}^3)),$ 

are equivalent to gradient flows of  $\mathcal{H}$  with respect to  $d_L$ .

The exponent  $p(\gamma) o \infty +$  as  $\gamma \downarrow -3$ .

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are equivalent to gradient flows of  $\mathcal{H}$  with respect to  $d_L$ . The exponent  $p(\gamma) \to \infty +$  as  $\gamma \downarrow -3$ .

#### Landau Equation

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Heat equation may be written as gradient flow of  ${\cal H}$  with respect to the 2-Wasserstein distance [JKO98]

$$\partial_t \rho = -\nabla_{W_2} \mathcal{H}(\rho) = \nabla \cdot \left( \rho \nabla \frac{\delta \mathcal{H}}{\delta \rho} \right), \quad \frac{\delta \mathcal{H}}{\delta \rho} = \log \rho.$$

The entropy-dissipation of heat flow reads

$$\mathcal{H}(
ho_t) + \int_0^t \underbrace{\int_{\mathbb{R}^d} 
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#### Dynamic Wasserstein distance

The Benamou-Brenier formulation [BB00] of 2-Wasserstein distance is

$$W_2^2(f_0, f_T) = \inf_{(f, M)} \left\{ T \int_0^T \int_{\mathbb{R}^d} \frac{|M|^2}{f} dx dt \mid \frac{\partial_t f + \nabla \cdot M = 0}{f(0) = f_0, f(T) = f_T} \right\}.$$

 $M = -f \nabla \log f(= -\nabla f)$  is a candidate flux when  $f_t$  and  $f_{t+\Delta t}$  are points along the heat semigroup

$$W_2^2(f_t, f_{t+\Delta t}) \leq \Delta t \int_t^{t+\Delta t} D_h(f_s) ds, \quad |\dot{f}|^2_{W_2}(t) \stackrel{!}{=} D_h(f_t).$$

Extend this idea for Landau; construct  $d_L$  and prove

$$|\dot{f}|^2_{d_L}(t) = D_L(f_t).$$

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Gradient flow structures in kinetic theory

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Gradient flow structures in kinetic theory

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## New 'differential geometric' structure

## Recall

$$D_{h}(f) = \int_{\mathbb{R}^{d}} f |\nabla \log f|^{2} dx$$
  
$$D_{L}(f) = \frac{1}{2} \iint_{\mathbb{R}^{2d}} ff_{*} |v - v_{*}|^{2+\gamma} |\Pi[v - v_{*}] (\nabla \log f - \nabla_{*} \log f_{*})|^{2} dv_{*} dv.$$

Define a differential operator for  $\phi = \phi(v)$ 

$$[\tilde{\nabla}\phi](v,v_*) := |v-v_*|^{1+\frac{\gamma}{2}} \prod [v-v_*](\nabla \phi - \nabla_* \phi_*),$$

so that

$$D_L(f) = \frac{1}{2} \iint_{\mathbb{R}^{2d}} ff_* |\tilde{\nabla} \log f|^2 dv_* dv.$$

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Gradient flow structures in kinetic theory

## New 'differential geometric' structure

Recall

$$\begin{split} D_h(f) &= \int_{\mathbb{R}^d} f |\nabla \log f|^2 dx \\ D_L(f) &= \frac{1}{2} \iint_{\mathbb{R}^{2d}} ff_* |v - v_*|^{2+\gamma} |\Pi[v - v_*] (\nabla \log f - \nabla_* \log f_*)|^2 dv_* dv. \end{split}$$

Define a differential operator for  $\phi = \phi(v)$ 

$$[ ilde{
abla}\phi](\mathbf{v},\mathbf{v}_*) := |\mathbf{v}-\mathbf{v}_*|^{1+rac{\gamma}{2}} \Pi[\mathbf{v}-\mathbf{v}_*](
abla \phi - 
abla_* \phi_*),$$

so that

$$D_L(f) = \frac{1}{2} \iint_{\mathbb{R}^{2d}} ff_* |\tilde{\nabla} \log f|^2 dv_* dv.$$

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#### Dynamic Landau distance

Recall

$$W_2^2(f_0, f_1) = \inf \left\{ \int_0^1 \int_{\mathbb{R}^d} \frac{|M|^2}{f} dx dt \mid \begin{array}{c} \partial_t f + \nabla \cdot M = 0 \\ f(0) = f_0, \ f(1) = f_1 \end{array} \right\}.$$

We use now (the adjoint of)  $\tilde{\nabla}$  in the actual definition

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Now if  $f_0$  and  $f_1$  are evaluations of solutions to the Landau equation at t = 0, 1, then  $M = -ff_* \tilde{\nabla} \log f$  is a candidate flux with

 $|\dot{f}|^2_{d_L}(t) \leq D_L(f_t).$ 

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Gradient flow structures in kinetic theory

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Proof that  $d_L$  is a good metric

Apply arguments from Ambrosio, Gigli, Savaré and Dolbeault, Nazaret, Savaré [AGS08, DNS09]. The functional to be infimised (minimisers exist) in  $d_L$  is

$$\frac{1}{2}\int_0^1\iint_{\mathbb{R}^{2d}}\frac{|M|^2}{ff_*}dv_*dvdt.$$

The integrand function takes the form

$$(x,y)\in \mathbb{R}^d imes (0,\infty)\mapsto rac{1}{2}rac{|x|^2}{y}$$
 is jointly convex.

Calculus of variations + adaptation to gradient flows [DNS09] yield nice properties of  $d_L$ .

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#### $\mathsf{Gradient}\ \mathsf{flows}\ \Longleftrightarrow\ \mathsf{H}\text{-solutions}$

Key ingredient is **chain rule** for  $\partial_t f + \frac{1}{2} \tilde{\nabla} \cdot M = 0$  which is formally computed

$$\frac{d}{dt}\mathcal{H}(f_t) = \int_{\mathbb{R}^d} \partial_t f \log f = -\frac{1}{2} \int_{\mathbb{R}^d} \tilde{\nabla} \cdot M \log f = \frac{1}{2} \iint_{\mathbb{R}^{2d}} \tilde{\nabla} \log f \cdot M = \frac{1}{2} \iint_{\mathbb{R}^{2d}} \tilde{\nabla} \frac{\delta \mathcal{H}}{\delta f} \cdot M$$

H-solutions  $\implies$  gradient flows: Set  $M=-ff_* ilde{
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Gradient flow structures in kinetic theory

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Take *M* such that  $\partial_t f + \frac{1}{2}\tilde{\nabla} \cdot M = 0$  and

$$\frac{1}{2} \iint_{\mathbb{R}^{2d}} \frac{|M|^2}{ff_*} = |\dot{f}|^2_{d_L}.$$

The chain rule implies the inequality

$$\begin{aligned} \mathcal{H}(f_{T}) - \mathcal{H}(f_{0}) &= \frac{1}{2} \int_{0}^{T} \iint_{\mathbb{R}^{2d}} \tilde{\nabla} \log f \cdot M \\ \geq -\frac{1}{2} \int_{0}^{T} \iint_{\mathbb{R}^{2d}} \left( \frac{1}{2} f f_{*} |\tilde{\nabla} \log f|^{2} + \frac{1}{2} \frac{|M|^{2}}{f f_{*}} \right) \\ &= -\frac{1}{2} \int_{0}^{T} D_{L}(f) - \frac{1}{2} \int_{0}^{T} |\dot{f}|^{2}_{d_{L}}(t). \end{aligned}$$

But all inequalities have to be equalities so Young's/Cauchy-Schwarz implies co-linearity

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Easier to establish chain rule with this regularisation

$$\frac{d}{dt}\mathcal{H}^{\epsilon}(f_t) = \frac{1}{2}\iint_{\mathbb{R}^{2d}} \tilde{\nabla} \frac{\delta \mathcal{H}^{\epsilon}}{\delta f} \cdot M.$$

Need estimates uniform in  $\epsilon > 0$  for

$$\left|\frac{1}{2}\iint_{\mathbb{R}^{2d}}\tilde{\nabla}\frac{\delta\mathcal{H}_{\epsilon}}{\delta f}\cdot M\right| \leq \frac{\sqrt{2}}{2}\left(\frac{1}{2}\iint_{\mathbb{R}^{2d}}ff_{*}\left|\tilde{\nabla}\frac{\delta\mathcal{H}_{\epsilon}}{\delta f}\right|^{2}\right)^{\frac{1}{2}} + \frac{\sqrt{2}}{2}\left(\frac{1}{2}\iint_{\mathbb{R}^{2d}}\frac{|M|^{2}}{ff_{*}}\right)^{\frac{1}{2}}$$

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May 17, 2022

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Gradient flow structures in kinetic theory  $<\square \succ < \boxdot \succ < \boxdot \succ < \boxdot \succ = \odot < \bigcirc < \odot _{23/31}$ 

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#### Convergence of dissipations as $\epsilon \downarrow 0$

For a fixed f, we need to establish  $D_L^{\epsilon}(f) \rightarrow D_L(f)$  given  $D_L(f) < +\infty$ , or in full detail

$$\begin{split} &\iint_{\mathbb{R}^{2d}} ff_* |v - v_*|^{2+\gamma} |\Pi[v - v_*] (\nabla G^\epsilon * \log[f * G^\epsilon](v) - \nabla G^\epsilon * \log[f * G^\epsilon](v_*))|^2 \\ &\downarrow \text{ as } \epsilon \downarrow 0 \\ &\iint_{\mathbb{R}^{2d}} ff_* |v - v_*|^{2+\gamma} |\Pi[v - v_*] (\nabla \log f - \nabla_* \log f_*)|^2. \end{split}$$

Expand the square to effectively estimate two distinct terms

$$\int f_* \int f |v - v_*|^{\gamma} |v \times \nabla G^{\epsilon} * \log[f * G^{\epsilon}](v)|^2 dv dv_*$$

and

$$\int f_* |v_*|^2 \int f |v - v_*|^{\gamma} |\nabla G^{\epsilon} * \log[f * G^{\epsilon}](v)|^2 dv dv_*.$$

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# Use of Extended Dominated Convergence

# We do not have an integrable majorant directly, but we only care that the integral converges.

Idea: Suppose  $I_{\epsilon}(v) = A(v)(B * G^{\epsilon})(v)$  is a sequence and we want to show

$$\int I_{\epsilon} \to \int AB.$$

Notice

$$\int I_{\epsilon} = \int A(B * G^{\epsilon}) = \int (A * G^{\epsilon})B$$

It is enough to show that  $(A * G^{\epsilon})(v)B(v)$  has an integrable majorant even if we have no bounds for  $A(B * G^{\epsilon})$ .

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# Commuting $G^{\epsilon}*$

Apply (many many many times) an extended Dominated Convergence Theorem after shuffling  $G^{\epsilon}*$ , for example

$$\int f_* |v_*|^2 \int f |v - v_*|^{\gamma} |\nabla G^{\epsilon} * \log[f * G^{\epsilon}](v)|^2 dv dv_* \leq \dots$$
$$\leq C_{f,\gamma} \int [f * G^{\epsilon}] \langle v \rangle^{\gamma} |\nabla \log[f * G^{\epsilon}]|^2.$$

Recognise Jensen's inequality

$$[f * G^{\epsilon}] |\nabla \log[f * G^{\epsilon}]|^2 = \frac{|\nabla [f * G^{\epsilon}]|^2}{[f * G^{\epsilon}]} \leq G^{\epsilon} * \left[\frac{|\nabla f|^2}{f}\right].$$

Boundedness of Fisher information-type term from Desvillettes [D15, D16]

$$\int \langle v \rangle^{\gamma} \, \frac{|\nabla f|^2}{f} + \int \langle v \rangle^{\gamma} \, \frac{|v \times \nabla f|^2}{f} \leq C(D_L(f) + 1)$$

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#### Landau Equation

Literature overview H-theorem

**Preview of Results** 

Gradient Flow framework

Review of heat equation Treatment of Landau

# Brief discussion on numerics

#### Another motivation for regularisation

# The $d_L$ -gradient flow of $\mathcal{H}^\epsilon$ is the PDE $\partial_t f =$

$$\nabla \cdot \left( f \int_{\mathbb{R}^d} f_* |v - v_*|^{\gamma + 2} \Pi[v - v_*] (G^{\epsilon} * \nabla \log(G^{\epsilon} * f) - G^{\epsilon} * \nabla_* \log(G^{\epsilon} * f_*)) dv_* \right)$$

This PDE inherits conservation of mass, momentum, and energy, as well as a regularised H-theorem. Destroying the parabolicity allows for a numerical **particle method** as investigated in Carrillo, Craig, Patacchini '19 (and also recently by Craig et al.). This equation (with a different mollifier) was the focus of Carrillo, Hu, Wang, Wu '20. The  $d_L$ -gradient flow of  $\mathcal{H}^\epsilon$  is the PDE  $\partial_t f =$ 

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Landau is parabolic so the regularised entropy  $\mathcal{H}^\epsilon$  is needed for particle solutions

$$f(t, \mathbf{v}) \sim \mu^{N}(t, \mathbf{v}) := \frac{1}{N} \sum_{i=1}^{N} \delta_{\mathbf{v}^{i}(t)}(\mathbf{v}).$$

Obtain an interacting particle system of ODEs for  $i = 1, \ldots, N$ 

$$\dot{v}^{i}(t) = \frac{1}{N} \sum_{j=1}^{N} |v^{i} - v^{j}|^{2+\gamma} \prod [v^{i} - v^{j}] (\nabla G^{\epsilon} * \log[\mu^{N} * G^{\epsilon}](v^{j}) - \nabla G^{\epsilon} * \log[\mu^{N} * G^{\epsilon}](v^{j})]$$

We tested our method in 3D also for Coulomb molecules ( $\gamma = -3$ ) and observed heuristic (almost) second order accuracy.

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Theorem (Existence and equivalence for  $\epsilon > 0$  (CDDW20+)) Fix  $\epsilon > 0$ , an interval [0, T], and  $\gamma \in [-4, 0]$ . Then there exists a gradient flow of  $\mathcal{H}^{\epsilon}$  with respect to  $d_L$  in  $\mathcal{P}_2(\mathbb{R}^d)$ . Furthermore, all weak solutions of the regularised Landau equation are equivalent to gradient flows.

Proof.

**Existence** handled by JKO variational scheme [JKO98] given initial  $\mu_0 \in \mathcal{P}_2(\mathbb{R}^d)$  and time step  $\tau > 0$ 

$$\nu_0^{\tau} := \mu_0, \quad \nu_n^{\tau} \in \operatorname{argmin}_{\lambda \in \mathcal{P}_2} \left[ \mathcal{H}^{\epsilon}(\lambda) + \frac{1}{2\tau} d_L^2(\nu_{n-1}^{\tau}, \lambda) \right], \quad n \in \mathbb{N}.$$

Equivalence handled by chain rule

$$\frac{d}{dt}\mathcal{H}^{\epsilon}(f) = \frac{1}{2}\iint_{\mathbb{R}^{2d}} \tilde{\nabla} \frac{\delta \mathcal{H}^{\epsilon}}{\delta f} \cdot M, \quad \text{given } \partial_t f + \frac{1}{2}\tilde{\nabla} \cdot M = 0.$$

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## Concluding remarks

- Provided a gradient flow description of Landau equation for soft potentials extending Erbar's treatment of Boltzmann for bounded potentials.
- Initiated gradient flow theory analysis of numerical experiments for *e*-regularised problem.
- Introduced a new minimising movement procedure in the spirit of JKO for Landau.

Some future endeavours:

- Extend gradient flow formulation to  $\gamma = -3$ .
- Leverage gradient flow theory (e.g. generalised geodesic convexity) to prove uniqueness for  $\gamma = -3$ .
- Understand grazing collision limit in terms of gradient flows (e.g. using Γ-convergence). Published in Nonlinear Analysis '22 √!

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